



**Using (Q)SARs, TTC, molecular docking simulation and read-across as a first tier in mixture toxicity risk assessment**

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Dutch Nat.Inst.Public Health & Environment (RIVM)

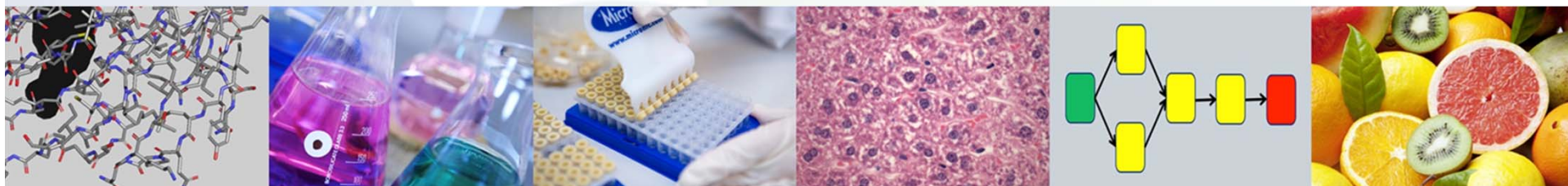
EUSAAT 2016, August 25



# Content



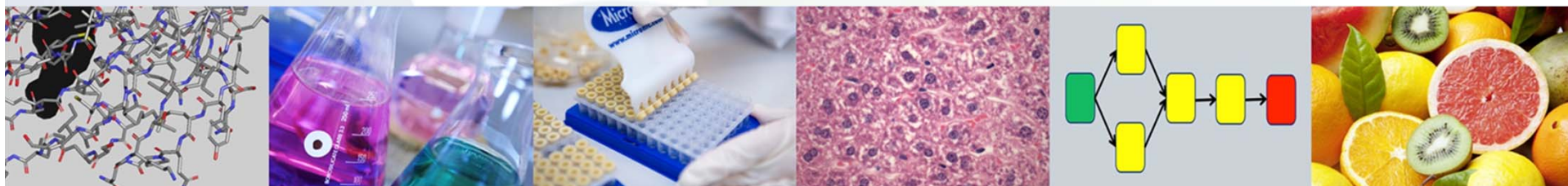
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3. QSAR to determine which Common Assessment Group(s) apply
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6. Refine the Cumulative Risk Assessment -> in vitro assays



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# European Parliament asked for CRA



- Consumer groups
- European Parliament
- Regulation 396/2005, art 14
- EFSA colloquium and EFSA opinions
- EU funded project ACROPOLIS

Meeting

Date

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# Directive EC 396/2005 and 1007/2009



## Regulation EC 396/2005 on maximum residue levels (MRLs)

It is also important to carry out further work to develop a methodology to take into account cumulative and synergistic effects. In view of human exposure to combinations of active substances and their cumulative and possible aggregate and synergistic effects on human health, MRLs should be set after consultation of the European Food Safety Authority.

## Regulation EC 1107/2009 on the placing of PPPs on the market

"...a PPP shall not have harmful effects on human health, including that of vulnerable groups, or animal health, taking into account known cumulative and synergistic effects where the scientific methods accepted by the Authority to assess such effects are available.."

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# EFSA grouping chemicals into CAGs



## Cumulative Assessment Groups (CAG)s

- Level 1: organ level
- Level 2: phenomenological endpoints
- Level 3: mode of action
- Level 4: mechanism of action

EFSA opinions to be expected in 2016/17

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## LEVEL 1

### EFSA grouping pesticides into CAG

#### 16 organs identified

- Adrenal gland
- Bone marrow
- Bones/skeleton
- Cardiovascular system
- Eye
- Gallbladder
- Haematological system
- Kidney
- **Liver**
- Muscles
- Nervous system
- Parathyroid gland
- **Reproductive system**
- **Developmental toxicity**
- Spleen
- Thyroid
- Urinary bladder



## LEVEL 2 EFSA grouping into CAG



CAG 2A: hypertrophy

CAG 2B: **fatty changes (steatosis)**  
**90 pesticides identified**  
**which non-pesticide**  
**chemicals need to be**  
**included?**

CAG 2C: cell degeneration/cell  
death

CAG 2D: inflammation

CAG 2E: foci of cellular alteration

CAG 2F: neoplasm

CAG 2G: lesion of biliary  
epithelium

CAG 2H: porphyria

CAG 2I: cholestasis

CAG 2J: karyocytomegaly

CAG 2K: inclusions

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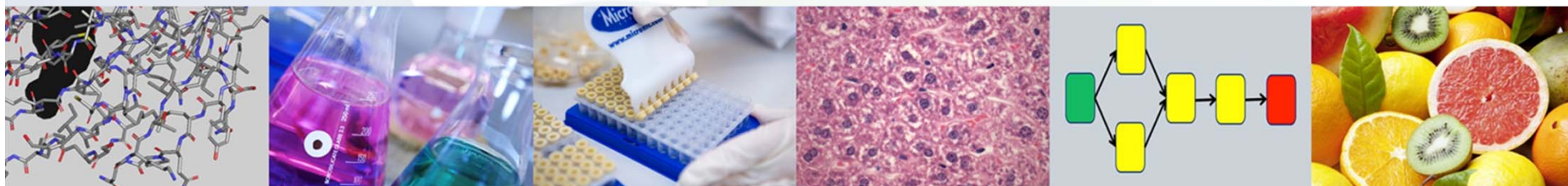




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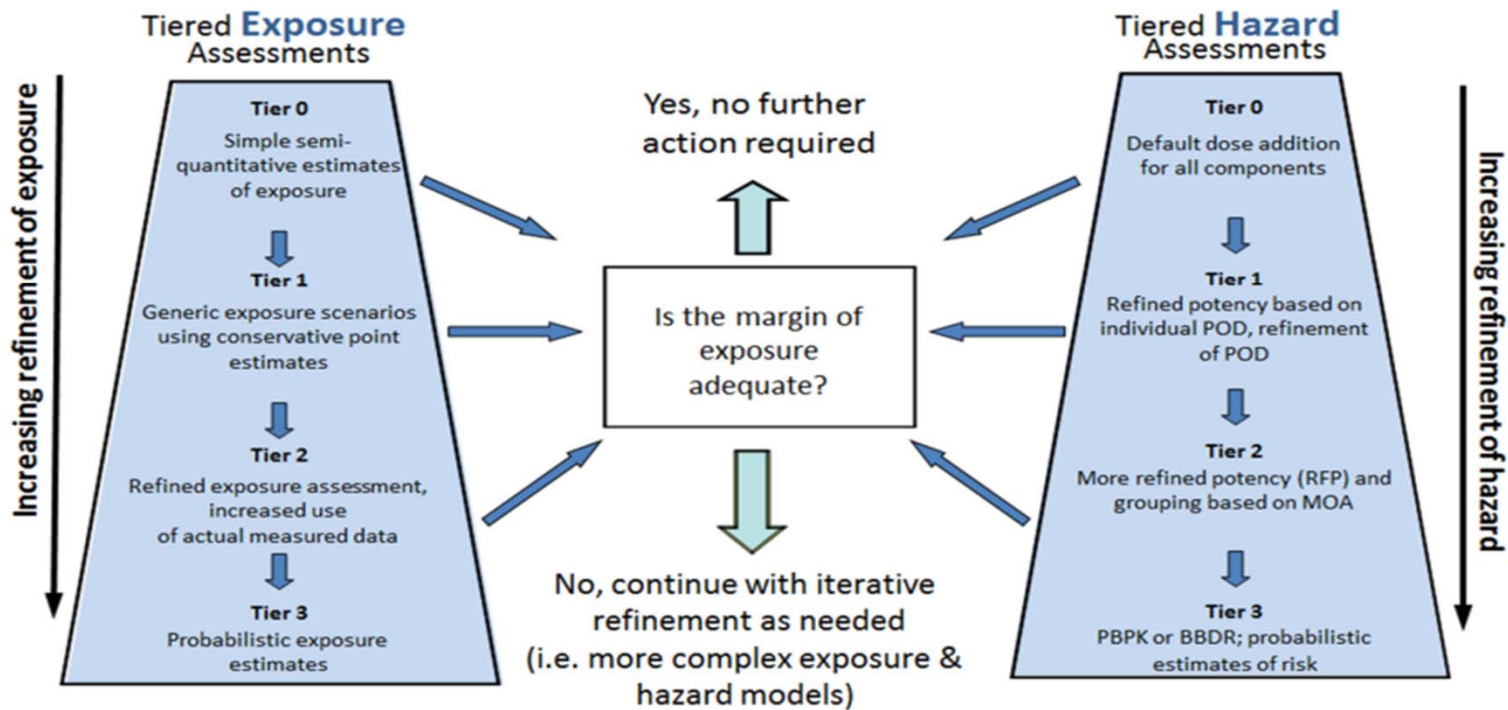
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# You can not test all the chemicals!

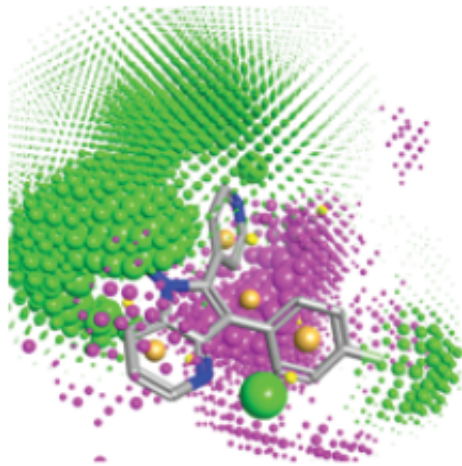


## Framework for mixtures: Tiered approaches (WHO, Meek et al. 2011)



# Concept testing strategy

QSAR



priorities

TTC  
approach

Possibility  
of co-  
exposure

bioassay tool box



In vivo confirmation



Very large  
number of  
chemicals

Large number of  
chemicals and  
mixture experiment

Selected number of  
chemicals

High uncertainty

Refine and retain

Reduced uncertainty

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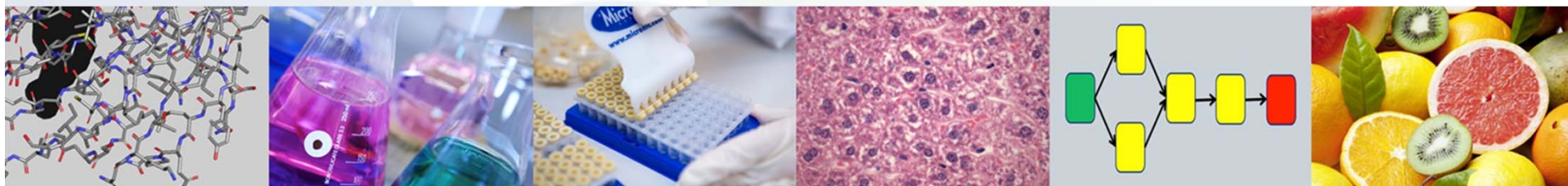
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## QSARs for CAG Liver Toxicity

Model	Sensitivity	Specificity	Accuracy
COSMOS LXR-binding QSAR model (PADEL descriptors) <sup>a</sup>	0.03	0.98	0.45
COSMOS LXR-binding QSAR model (RDKit descriptors)	0.69	0.48	0.60
COSMOS Nuclear Receptor model	0.31	0.80	0.53
DEREK Nexus (equivocal and above positive)	0.45	0.60	0.52
Fera QSAR model using CDK descriptors	0.85	0.24	0.58
MULTICASE Highest Consensus model (no call/out of domain as positive)	0.72	0.31	0.54
OCHEM AhR binding model	0.29	0.85	0.54
OCHEM PPARgamma model	0.30	0.86	0.55
OECD QSAR Toolbox HESS alerts	0.37	0.72	0.53
PaDEL-DD Predictor	0.78	0.16	0.50
Pizzo structural alert	0.46	0.90	0.66
Majority Consensus: Positive if 5 or more models positive	<b>0.63</b>	<b>0.64</b>	<b>0.64</b>

## Bayesian statistics applied to QSAR battery

- Take into account strength (and weakness) of individual models
- Assessment of uncertainty in the CAG assignment

-> Substance A is part of CAG liver tox with XX% probability

- **RETAIN (and REFINE):**

**ALL substances are retained in the CAG, but with individual probability of contributing to the effect.**



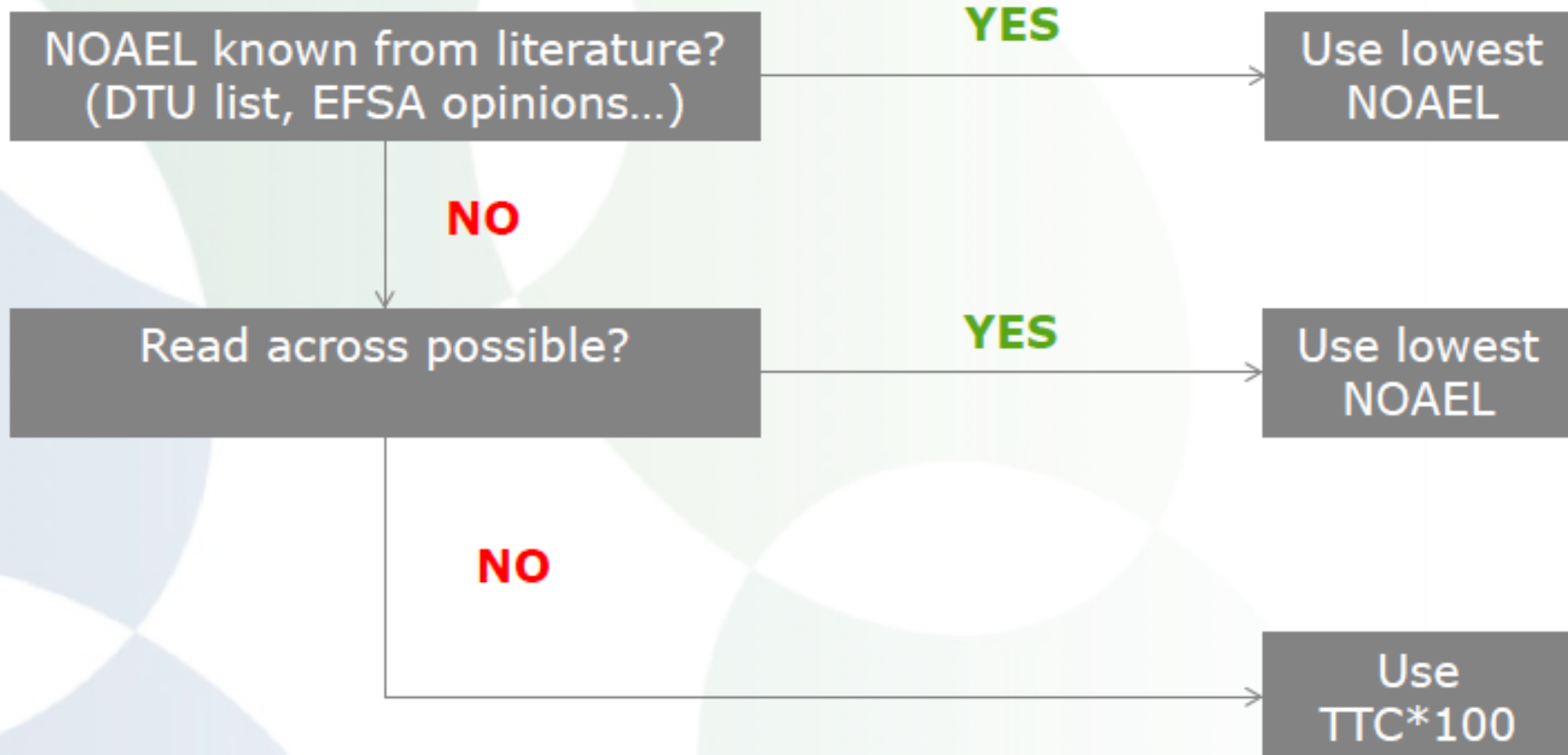
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# CAGS & RPFs (WP2): Assigning NOAELS for RPFs



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# CAGS & RPFs (WP2): Assigning NOAELS for RPFs



NOAEL known from literature?  
(DTU list, EFSA opinions...)

YES

Use lowest  
NOAEL

NO

Read across possible?

YES

Use lowest  
NOAEL

NO

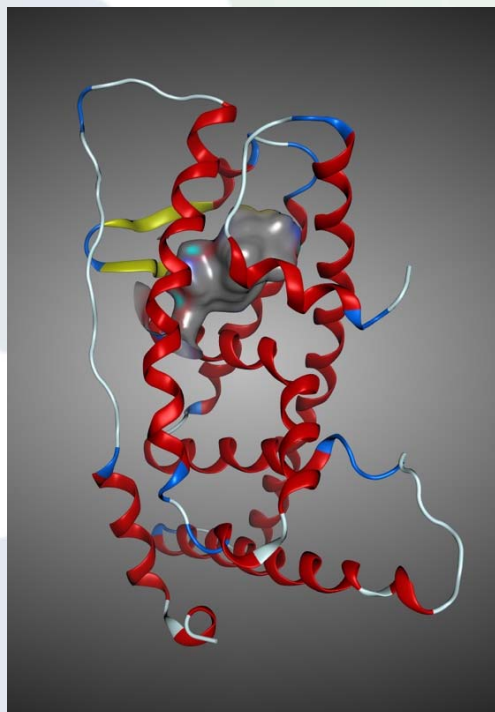
TTC: 5th percentile NOAEL animal  
studies converted to TTC value using  
the same 100-fold safety factor

Use  
TTC\*100



## QSARs: Docking - Estrogenicity

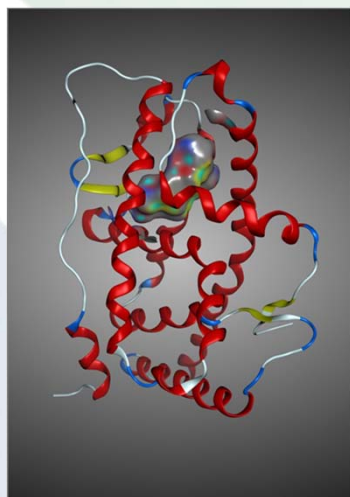
### 3) Molecular docking of EUROMIX database on h-Estrogen Receptor alpha (h-ERa) LBD



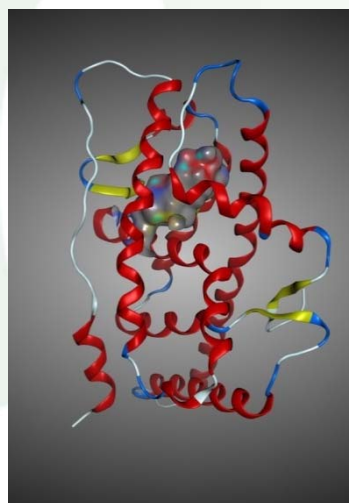
Compound	Binding free energy (kcal/mol)	dataset
Ethanol, 2-[2-(4-nonylphenoxy)ethoxy]-	-9.2	59_Easis.sdf
131860338 - Azoxystrobin	-8.4	271_PPP.sdf
17924924 - Zearalenone	-8.1	20_Mycotoxin.sdf
17 beta-estradiol	-8.1	Natural ligands



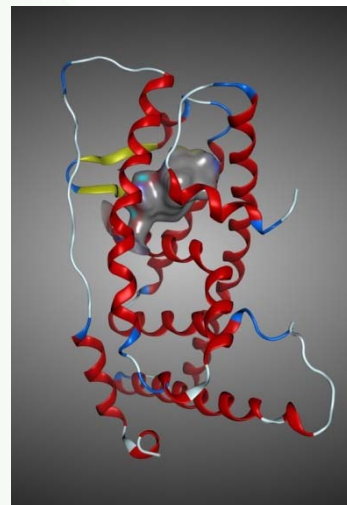
# QSARs: Endocrine Docking models



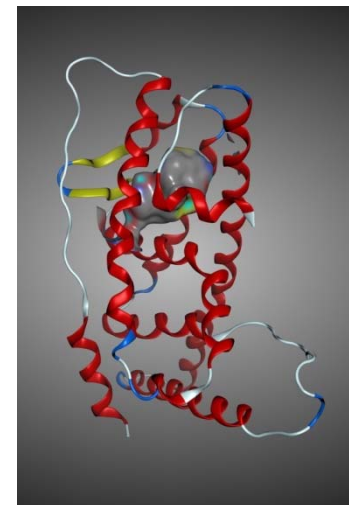
hPR



hAR



hER-a



hER-b

The following crystallographic structures of sex hormone receptor ligand binding domains were selected:

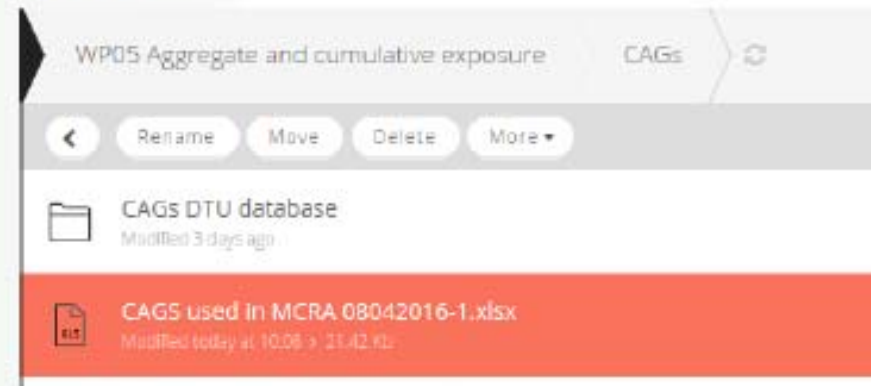
Receptor	PDB entry	Co-crystallized ligand	Natural hormone used as positive control
hPR	1ZUC	tanaproget	progesterone
hAR	2AM9	testosterone	dihydrotestosterone
hER-alpha	3UUD	estradiol	estradiol
hER-beta	3OLS	estradiol	estradiol



# CAGs & RPFs



## Overview of data used in calculations



A	B	C	D	E
idCompound	Name	idEffect	LimitDose	ModelCode
RF-00000451-ORG	Di-n-octyl phthalate	Liver2b	250	RA
RF-00000177-TOX	Fumonisin B1	Liver2b	37.2	RA
RF-00000210-TOX	Phomopsins	Liver2b	0.12	TTCx100
RF-00000078-ORG	HBCD alpha isomer	Liver2b	2.4	TTCx100
RF-00000079-ORG	HBCD beta isomer	Liver2b	2.4	TTCx100
RF-00000080-ORG	HBCD gamma isomer	Liver2b	2.4	TTCx100
RF-0135-001-PPP	Diflufenican	Liver2b	0.12	TTCx100
RF-0279-001-PPP	Mesotrione (RD)	Liver2b	0.12	TTCx100
RF-0343-001-PPP	Picloram	Liver2b	0.12	TTCx100
RF-0384-003-PPP	Quizalofop (including Quizalofop-P)	Liver2b	0.12	TTCx100
RF-0451-001-PPP	Ziram	Liver2b	0.024	TTCx100
RF-0011-001-PPP	Abamectin (RD)	Liver2b	0.25	NOAEL
RF-0014-001-PPP	Acetamiprid	Liver2b	7	NOAEL
RF-0112-001-PPP	Cypermethrin (RD)	Liver2b	1.9	NOAEL

Read across



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# Hazard Quotient concept and mixtures (an example)



	General threshold (mg/kg bw/day)	Type of general threshold (ch	water conc (ug/l)	daily exposure (mg/kg bw)	HQ	
metal 1	0.00040		21	0.0006	1.5	
metal 2	0.02000		7	0.0002	0.01	
metal 3	1.00000		42	0.0012	0.0012	
drug 1	0.01667	Min Ther Dose/ UF	9	0.000257143	0.015428571	
drug 2	0.33333	Min Ther Dose/ UF	0.35	0.00001	0.00003	
drug 3	0.08333	Min Ther Dose/ UF	0.08	2.28571E-06	2.74286E-05	
drug 4	0.02000	Min Ther Dose/ UF	0.12	3.42857E-06	0.000171429	
pesticide 1	0.00020	TDI	8	0.000228571	1.142857143	
pesticide 2	0.05000	TDI	10	0.000285714	0.005714286	
pesticide 3	0.00007	TDI	0.01	2.85714E-07	0.004081633	
industrial chemical	0.07000	TDI	4	0.000114286	0.001632653	
analyte	0.00130	TTC	0.17	4.85714E-06	0.003736264	
analyte	0.00130	TTC	0.07	0.000002	0.001538462	
analyte	0.00780	TTC	0.01	2.85714E-07	3.663E-05	
analyte	0.00780	TTC	0.35	0.00001	0.001282051	
					HI	2.68774
					HQ max	1.5
					MCR	1.79182

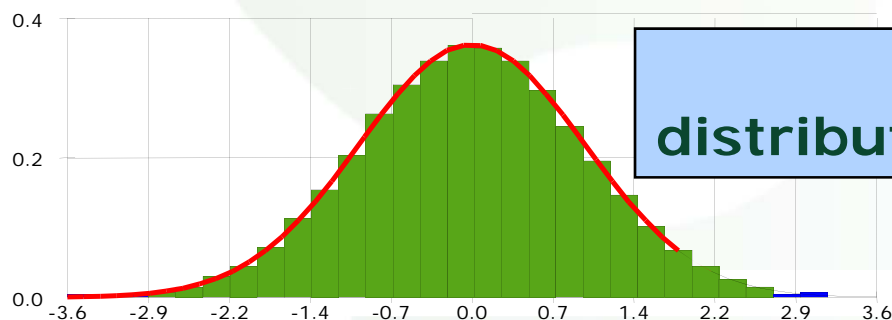
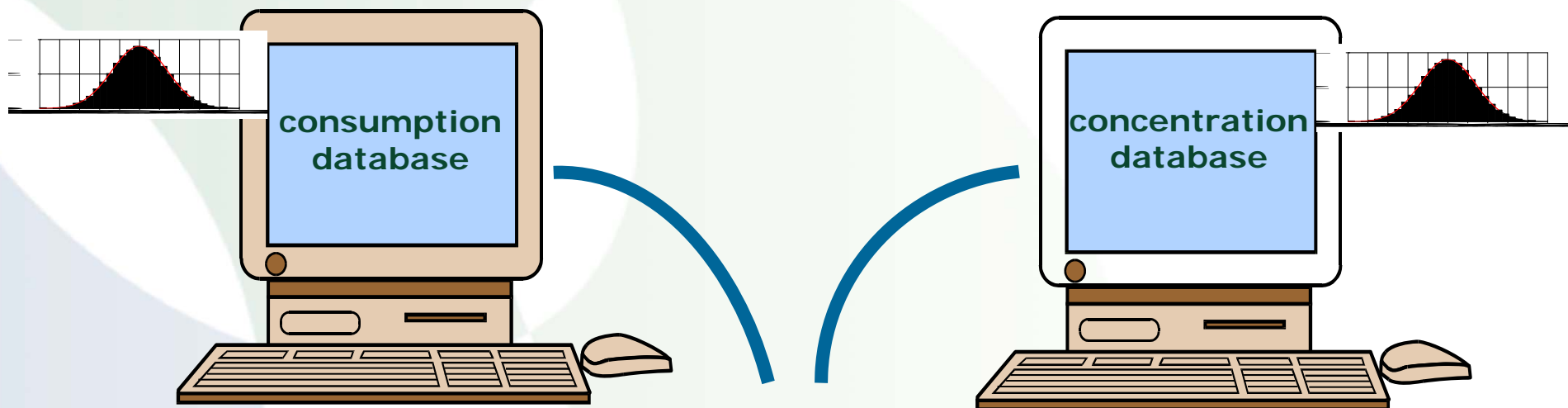
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# Exposure modelling: MCRA tool



**Result:  
distribution of exposure**

Random sampling from a concentration and a consumption database

van der Voet H, et al. (2015). The MCRA model for probabilistic single-compound and cumulative risk assessment of pesticides. Food and Chemical Toxicology, 79: 5-12.  
MCRA tool online: <https://mcra.rivm.nl/>

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# CAG Liver Toxicity - DEREK



## Deltamethrin – CAG liver toxicity

- Alert-617: Halogenated Hydrocarbon
- These compounds may cause steatosis and/or necrosis

The screenshot displays the DEREK software interface. The main window shows the chemical structure of Deltamethrin, a pyrethroid insecticide. The structure consists of a central carbon atom bonded to a cyano group (-C≡N), a phenoxy group (-O-C<sub>6</sub>H<sub>5</sub>), a piperonyl group (-C<sub>6</sub>H<sub>4</sub>-CH<sub>2</sub>-), and a propionic acid ester group (-O-C(=O)-CH<sub>2</sub>-CH<sub>2</sub>-C(CH<sub>3</sub>)<sub>2</sub>-). The propionic acid part is substituted with a 2-bromo-3-methylbut-2-enyl group.

Below the structure, the Prediction Navigator shows the following alerts:

- Derek KB 2014 1.0 [Certified by: Lhasa Limited, Leeds, Yorkshire, UK]
- Cyanide-type effects
- Hepatotoxicity
- mammal - PLAUSIBLE
- Alert - 617: Halogenated hydrocarbon
- Mitochondrial dysfunction
- Mutagenicity in vitro
- Neurotoxicity

The Alert Details window for Alert-617 is open, showing the following information:

**Description Image**

R1-R2

R5 R4  
R6 R3

R1 = Cl, Br, I  
R2 = alkyl group with less than 5 carbon atoms  
R3 = F, Cl, Br, I  
R4-R6 = C, H, F, Cl, Br, I  
Halothane or analogues are excluded

**Comments**

This alert describes the hepatotoxicity of halogenated aliphatic hydrocarbons. These compounds may cause necrosis and/or steatosis, and liver tumours in humans and experimental animals.

Haloaliphatic hydrocarbons have been extensively used in the chemical and agricultural industry, in medicine, and domestically as solvents and chemical reagents [Zimmerman].

These compounds are known occupational and environmental toxicants. Many of them are thought to possess a potential for causing liver damage [Zimmerman]. Acute hepatic injury in the form of centrilobular necrosis and macrovacuolar steatosis has been reported with the most toxic agents. Typical examples include carbon tetrachloride, widely employed as an experimental model for the study of certain hepatotoxic effects, chloroform, formerly used as an anaesthetic agent, tetrachloroethane, vinyl chloride and tetrachloroethylene. Chronic injury characterised by cirrhosis and/or hepatic carcinoma has also been described with the cited agents [Zimmerman].

**Validation Comments**

# CAG Liver Toxicity - DEREK



## Alert-617: Halogenated Hydrocarbon

- The hepatotoxicity is thought to require metabolic activation of the parent compound primarily mediated by CYP2E1. Formation of intermediates occurs via dehalogenation, reduction, or reductive oxygenation. These radical can covalently bind to cellular molecules, impairing crucial cellular processes such as lipid metabolism, form adducts with DNA or generate oxidative stress.

The screenshot displays the Nexus software interface. The main window shows a chemical structure of a complex molecule with a cyanide group, a nitrile group, and a brominated aliphatic chain. The interface includes a menu bar (File, Window, Prediction, Reports, Tools, Help), a toolbar, and a sidebar with a 'Predictions' panel. The 'Alert Details' panel on the right provides a description of the alert, including a diagram of the R1-R2 group and a list of substituents (R1-R6). The 'Comments' section at the bottom explains the hepatotoxicity of halogenated aliphatic hydrocarbons.

Alert Details

Description Image

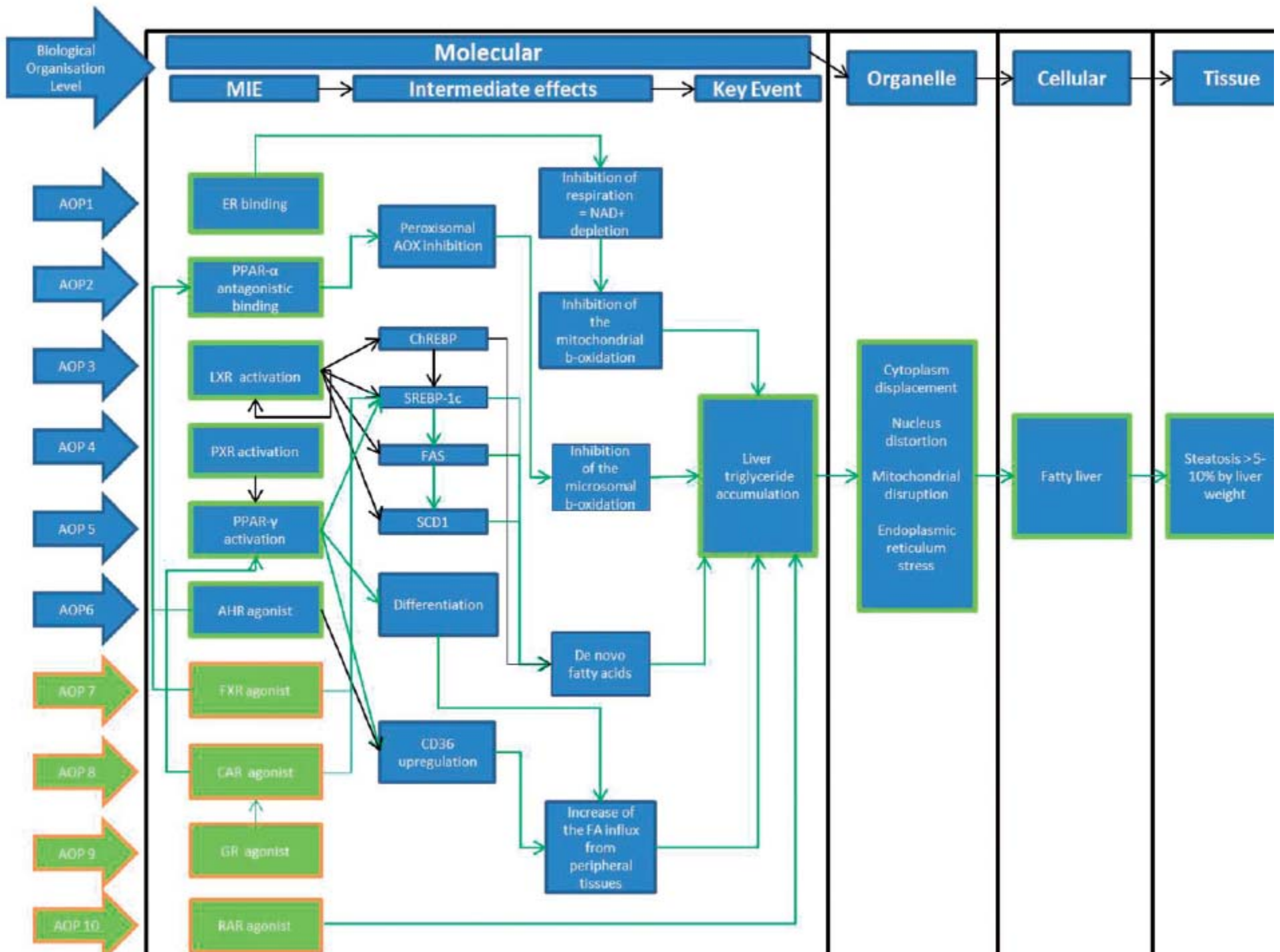
R1-R2

R5 R4  
R6 R3

R1 = Cl, Br, I  
R2 = alkyl group with less than 5 carbon atoms  
R3 = F, Cl, Br, I  
R4-R6 = C, H, F, Cl, Br, I  
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Comments

This alert describes the hepatotoxicity of halogenated aliphatic hydrocarbons. These compounds may cause necrosis and/or steatosis, and liver tumours in humans and experimental animals.



## Nuclear receptors associated with Hepatic Steatosis

Table 2. Summary of the effects on the liver following activation of nuclear receptors.

Nuclear receptor	Agonist effect on liver	Antagonist effect on liver
AHR	Induces hepatic steatosis	–
CAR	Induces hepatic steatosis	–
ER	Induces hepatic steatosis	Induces hepatotoxicity
FXR	Induces hepatic steatosis	–
GR	Induces hepatic steatosis	–
LXR	Induces hepatic steatosis	–
PPAR	PPAR $\gamma$ induces hepatic steatosis	PPAR $\alpha$ induces hepatic steatosis
PXR	Induces hepatic steatosis	–
RAR	Induces hepatic steatosis	–
RXR	Induces hepatic steatosis	–

### COSMOS Nuclear receptor alert models:

Mellor et al. 2016, Chem.Res.Tox 29:203

Mellor et al. 2016, Crit.Rev.Tox. 46:2



## Thanks to the EuroMix WP2 (in silico) team

**Ad Peijnenburg**

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**Ivano Eberini**

**Università degli Studi di Milano, Milano (IT)**

**and co-workers**

Meeting

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# EuroMix participants



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



Imperial College London



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