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# QSAR Uncertainty in the Maximum Permissible Emission of Triazoles



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**INTRODUCTION**

**METHODOLOGY** Maximum Permissible Emission  
PEC and PNEC Modeling  
Prediction of Substance Properties  
Uncertainty

**RESULTS**

**DISCUSSION**

**CONCLUSION**



## ■ Risk of Chemicals

- A Risk Ratio (RR) can be estimated as the ratio of
  - Predicted Environmental Concentration (PEC) and [kg/m<sup>3</sup>]
  - Predicted No Effect Concentration (PNEC) [kg/m<sup>3</sup>]

Looking at a *unit emission* rather than *real emission data*

- A safe Maximum Permissible Emission (MPE) can be estimated as the ratio of
  - PNEC and [kg/m<sup>3</sup>]
  - PEC [kg/m<sup>3</sup>] per unit emission [kg/day] [day/m<sup>3</sup>]
- Hence: Emission [kg/day] / MPE [kg/day] = RR



## ■ Maximum Permissible Emission

Emission to  
agricultural soil



Emission  
1 kg/day

Concentration in  
the Environment



PEC: Predicted  
Environmental  
Concentration

Effects on  
Aquatic Species



PNEC: Predicted  
No Effect  
Concentration

$$\text{MPE} = \text{PNEC} / \text{PEC}_{\text{unit emission}}$$



## ■ Triazoles

- Fungicides that interfere with fungi cell membrane
- Contamination of the aquatic environment



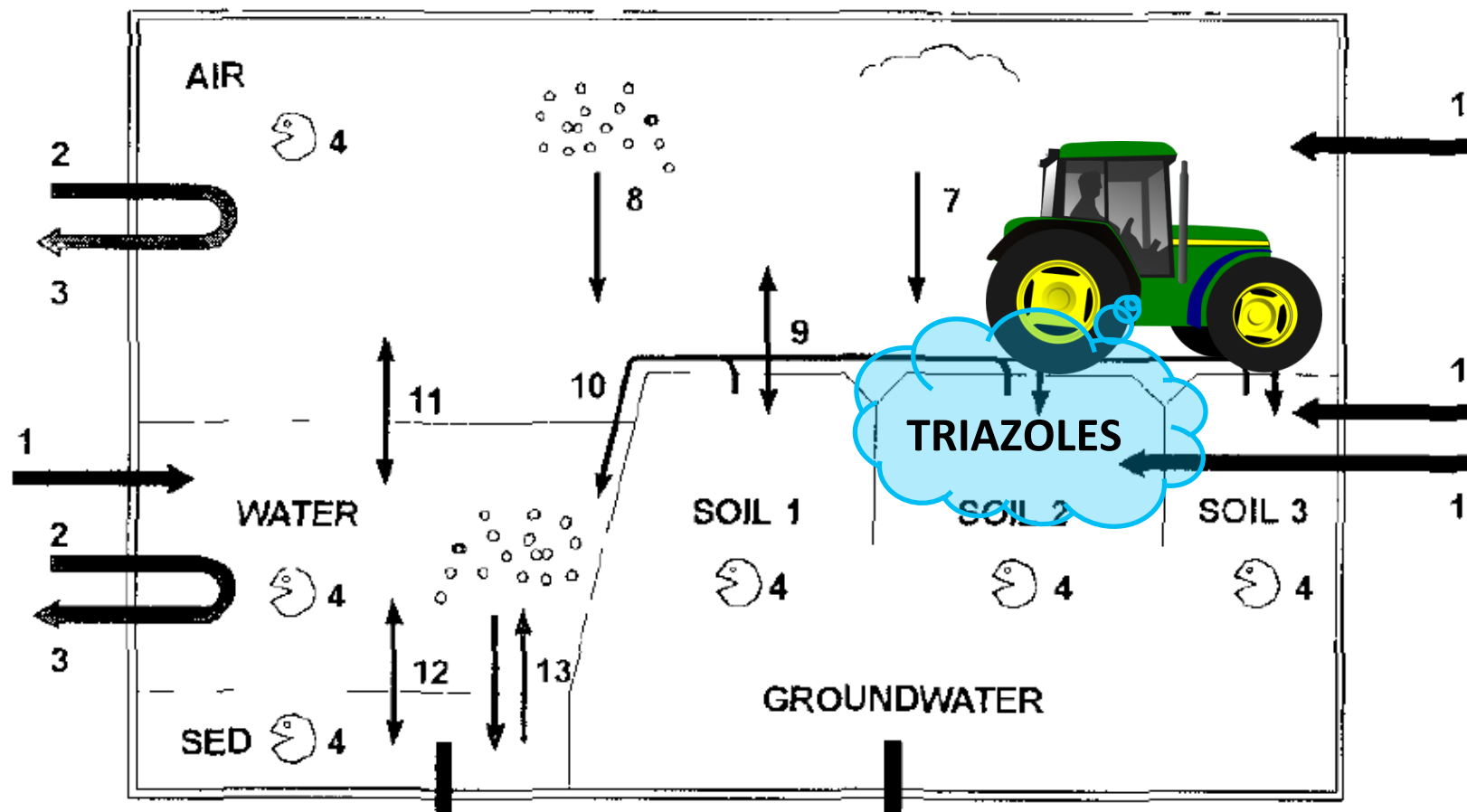
- Various effects in non-target organisms



## ■ Problem setting

- Chemical monitoring data and toxicity measurement data of triazoles are available to a limited extent only
- Substance properties can be predicted, e.g. with QSARs
- QSARs are uncertain
- The goals of this study:
  1. Quantify uncertainty ranges in the maximum permissible emission of 8 triazoles
  2. Determine the relative importance of the individual QSARs to the overall uncertainty

## ■ Multimedia Fate Model



**Simplebox**

Den Hollander HA, Van Eijkeren JCH, Van de Meent D (2004): SimpleBox 3.0: multimedia mass balance model for evaluating the fate of chemicals in the environment. RIVM, Bilthoven, NL



## ■ Multimedia Fate Model

Information requirements:

- Partitioning between environmental compartments
- Biodegradation in different compartments



## ■ QSAR Predictions for Substance Properties

For instance: vapor pressure

$$\text{Log VP} = 17.30 - 15.67 \text{BELp2} + 0.44 \cdot \text{RBN} + 1.38 \cdot \text{B09[N-Cl]}$$

descriptors of molecular structure

Other QSARs with same principle for :

- soil sorption partition coefficient
- aqueous solubility
- melting point
- biodegradation in air (rate constant for hydroxyl radical reaction)



## ■ Predictions of Biodegradation in Water

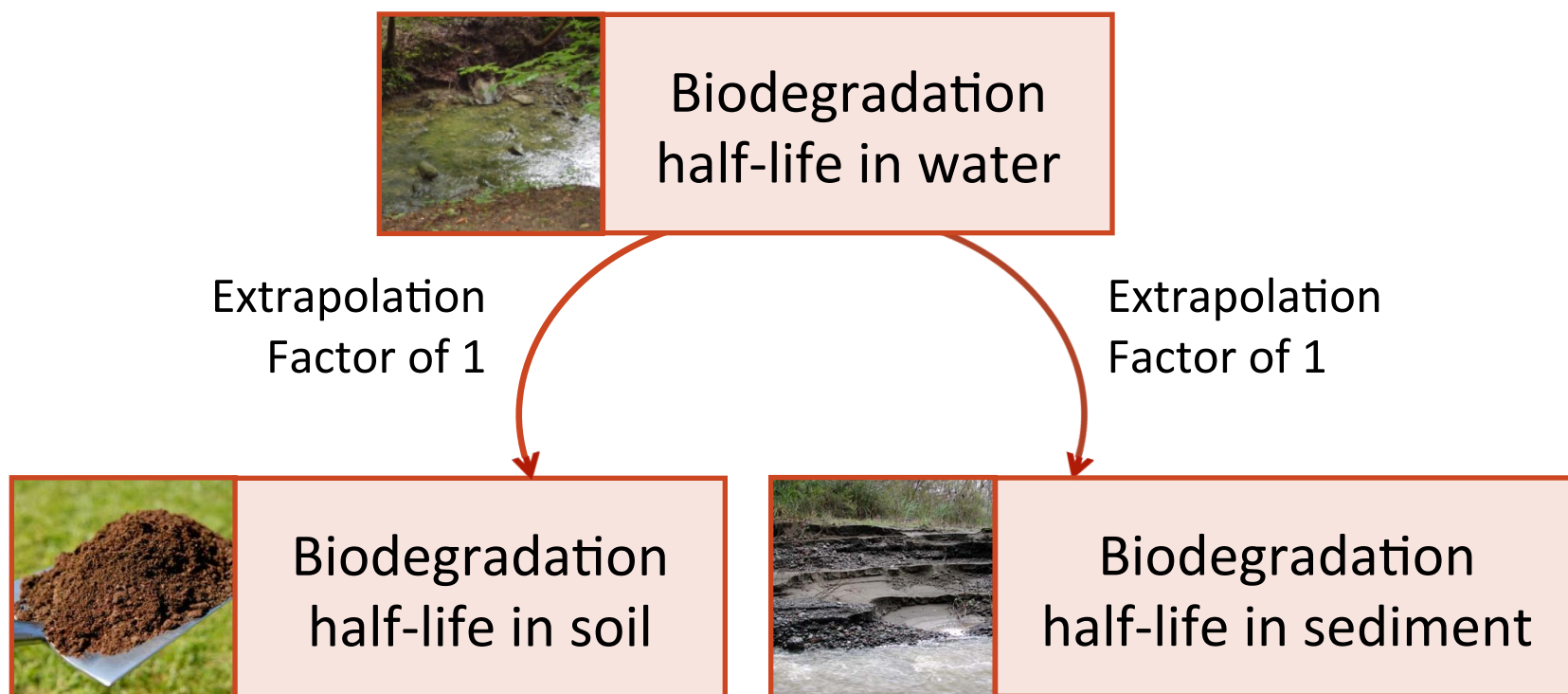
*D. Aronson et al. / Chemosphere 63 (2006) 1953–1960*



| EPI Suite™ Biowin3 | median (days) |
|--------------------|---------------|
| days-weeks         | 4.65          |
| weeks              | 8.35          |
| weeks-months       | 14.9          |
| months             | 85            |
| recalcitrant       | 88            |
| recalcitrant       | 281           |



## ■ Extrapolation to Soil and Sediment



- Assumption is reasonable for screening purposes
- Confirmed by dataset

- Sediment has been reported to *enhance* and to *inhibit* degradation



## ■ Predicted No Effect Concentration

Assessment Factor Method

$$PNEC = \frac{\text{lowest L(E)C50}}{1000}$$

QSARs for toxicity

- LC50 *Onchorynchus Mykiss*
- EC50 *Daphnia Magna*
- EC50 *Pseudokirchneriella Subcapitata*





## ■ Uncertainty in QSAR Predictions

- Uncertainty in prediction  $Y_p$  follows a student-t distribution

$$Y_p \sim \bar{Y}_p + t_{n-k-1} \cdot SE(Y_p - \bar{Y}_p)$$

- Distribution specified by
  - the predictive mean ( $\bar{Y}_p$ )
  - the predictive error ( $SE(Y_p - \bar{Y}_p)$ )
  - the number of data points in the training data set ( $n$ )
  - the number of descriptors in the linear regression model ( $k$ )
- Based on experimental data underlying the QSAR regressions



## ■ Uncertainty in Biodegradation

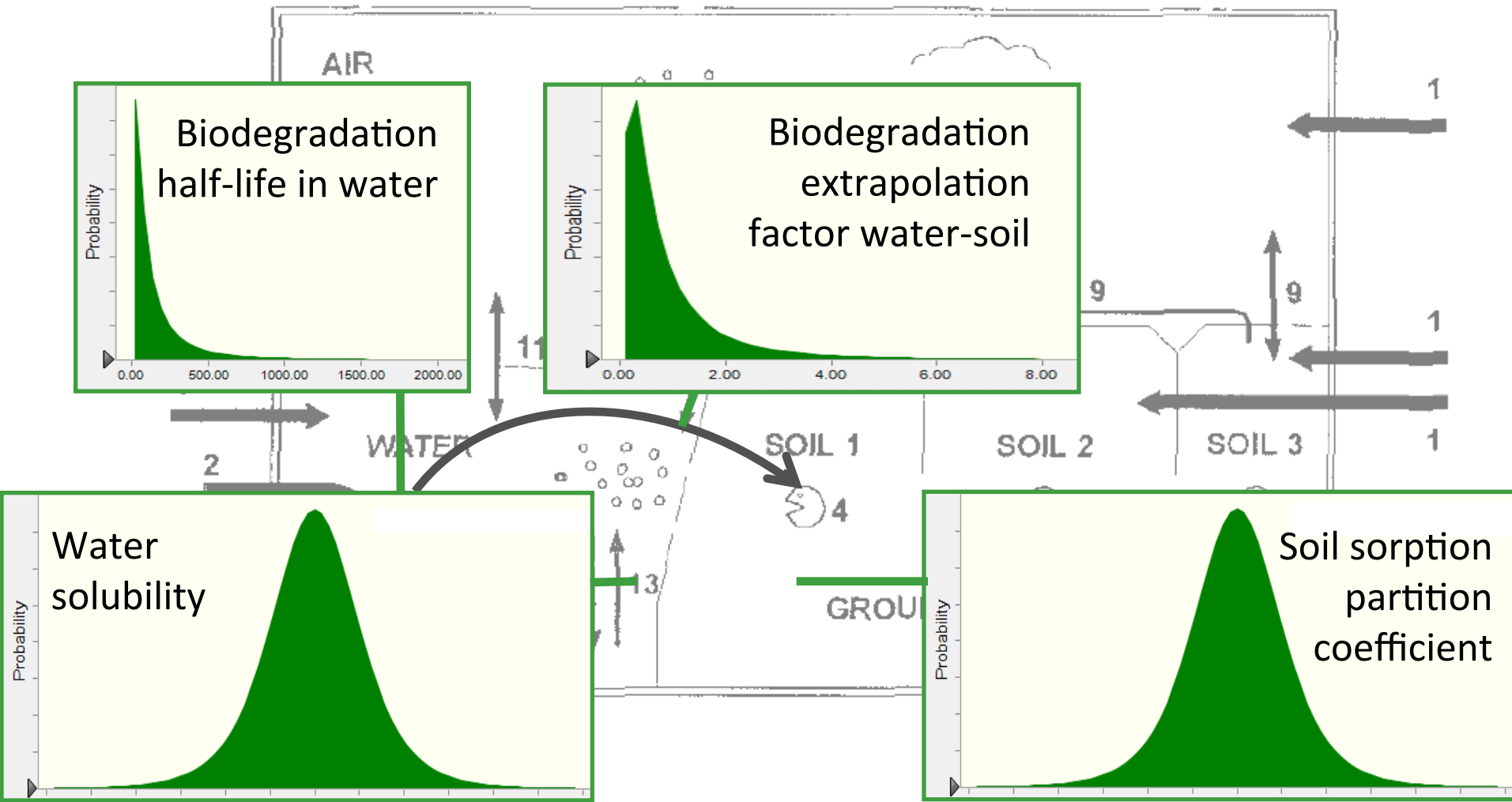
Log-normal distribution *D. Aronson et al. / Chemosphere 63 (2006) 1953–1960*

| EPI Suite™ Biowin3 | median (days) | 95% CI          |
|--------------------|---------------|-----------------|
| days-weeks         | 4.65          | (0.7 – 29.9)    |
| weeks              | 8.35          | (0.4 – 163.4)   |
| weeks-months       | 14.9          | (0.3 – 763.7)   |
| months             | 85            | (7.3 – 996.2)   |
| recalcitrant       | 88            | (7.7 – 1001.4)  |
| recalcitrant       | 281           | (13.3 – 5948.9) |

Extrapolation factor to soil and sediment followed a log-normal distribution with 95% CI (0.1 – 4.5)



## ■ Propagation of Uncertainty

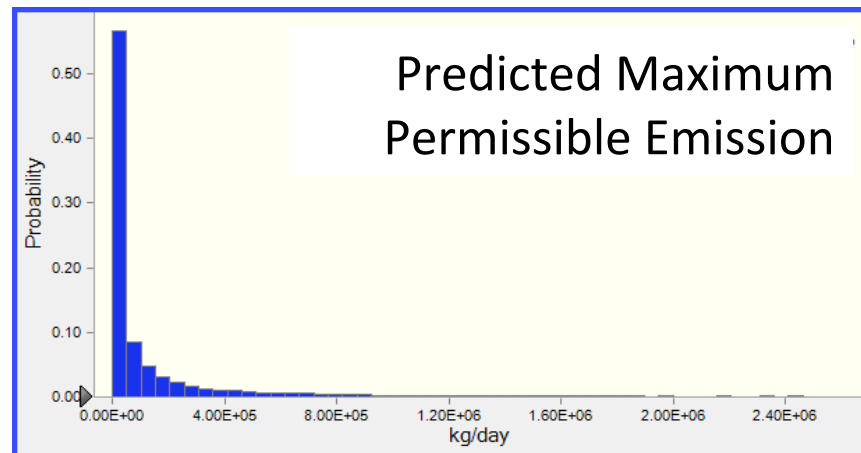




## ■ Propagation of Uncertainty



**ORACLE<sup>®</sup>**  
CRYSTAL BALL

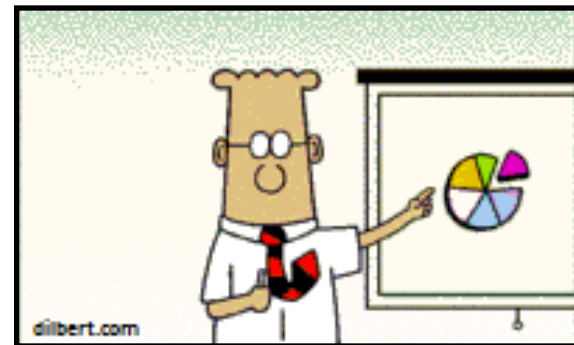




## ■ Analysis of Variance

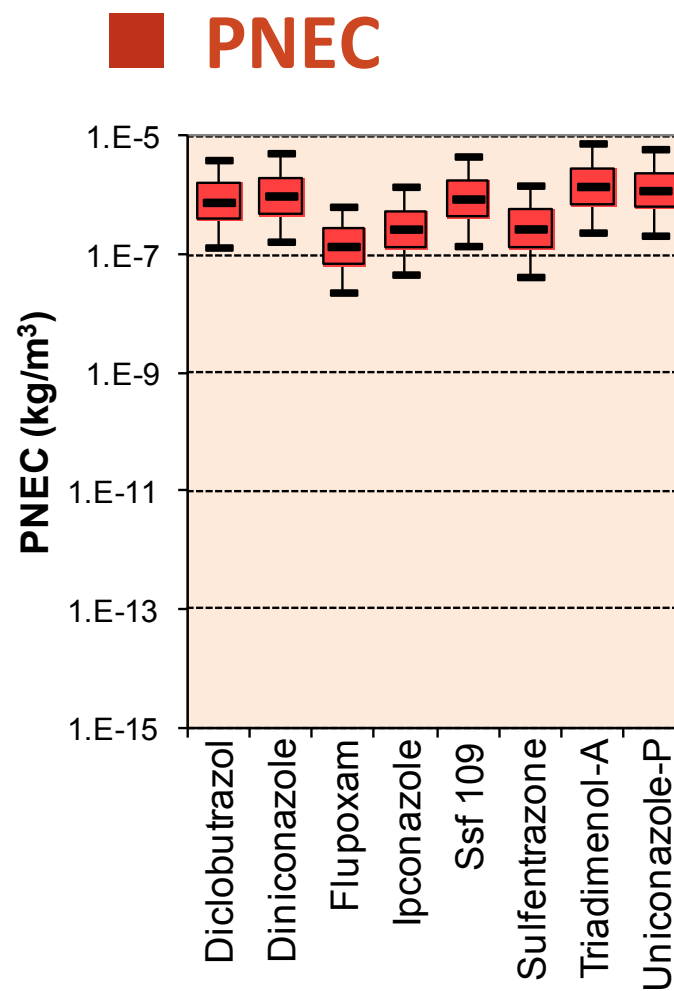
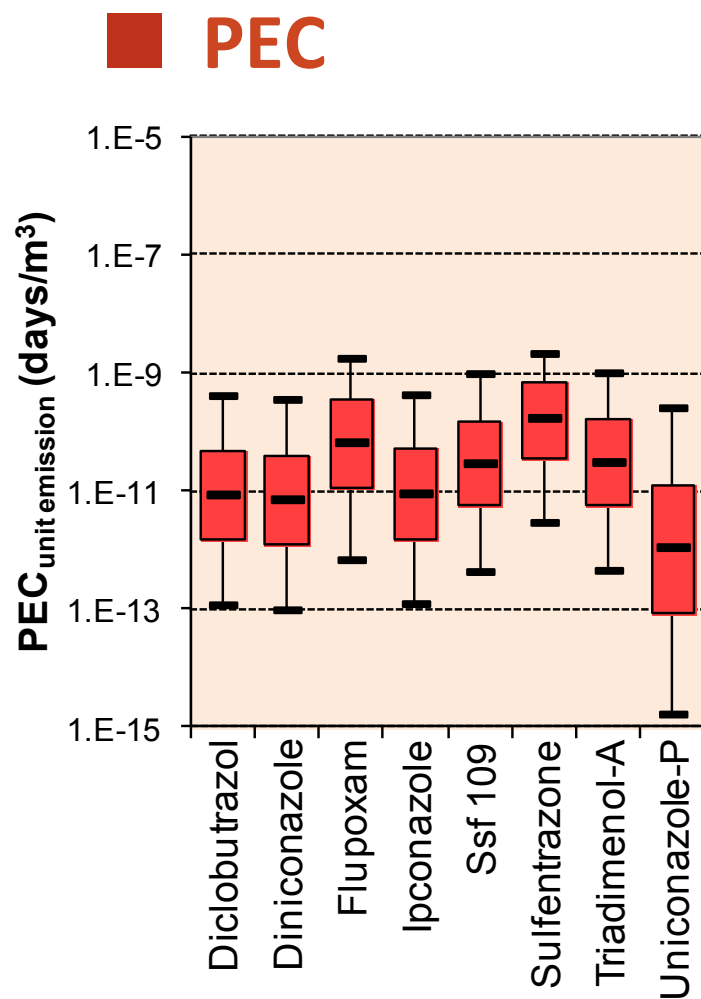
Crystal Ball:

- Spearman's rank correlation coefficients between each input parameter and the outcome variable
- Rank correlation coefficients were squared and normalized to 100 %
- Contribution to variance



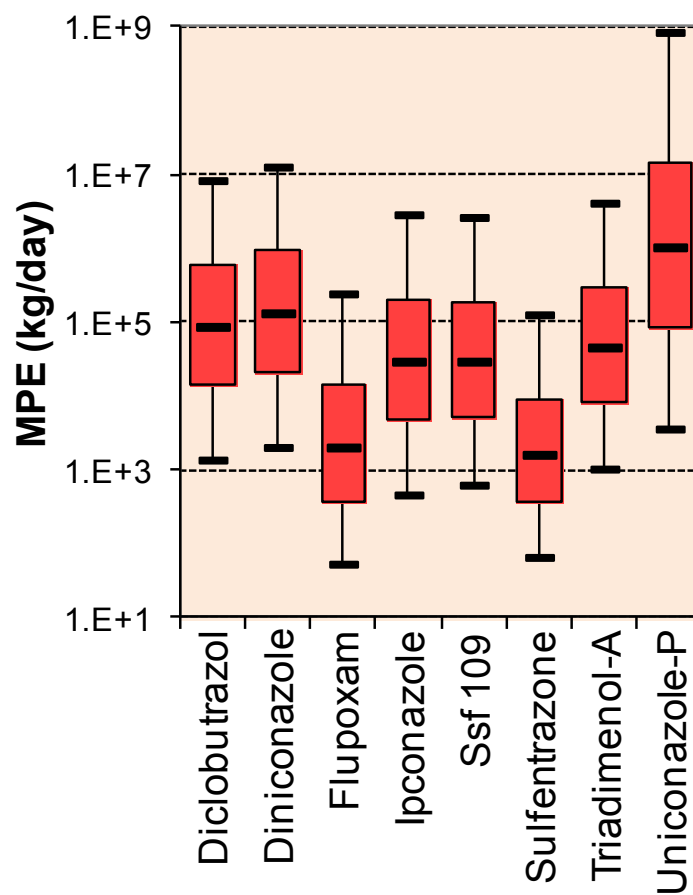


# Results





## Maximum Permissible Emissions





## ■ Analysis of Variance

| Parameter                                      | Diclobutrazol | Sulfentrazone | Uniconazole-P |
|--|---------------|---------------|---------------|
| Soil sorption partition coefficient            | 37.8%         | 23.5%         | 14.6%         |
| Biodegradation in water                        | 36.1%         | 43.9%         | 72.6%         |
| Biodegradation extrapolation factor water-soil | 14.5%         | 14.7%         | 7.5%          |
| LC50 O. Mykiss                                 | 9.2%          | 5.3%          | 4.1%          |
| EC50 P. Subcapitata                            | 2.3%          | 12.5%         | 1.1%          |

Contributions of aqueous solubility, melting point, vapor pressure, hydroxyl radical reaction, biodegradation extrapolation factor water-sediment, and EC50 D. Magna were  $\leq 0.1\%$



### ■ Limitations : Predictions outside the AD

- A QSAR's reliability is restrained by its Applicability Domain (AD), which is depending on
  - the number of training chemicals
  - the number of model variables
- Almost all QSAR predictions were within the AD



### ■ Limitations: Predictions outside the AD

- $k_{OH}$  of Flupoxam and Sulfentrazone
  - no key property
- $K_{oc}$  of Flupoxam
  - important property: movement and leaching from the soil
  - prediction (and uncertainty) similar to other predictions
- $EC_{50}$  of *P. Subcapitata* of Flupoxam
  - prediction (and uncertainty) similar to other predictions

Warning for model applicability,  
but not a final decision on prediction quality

(Nikolova and Jaworska 2003)



### ■ Limitations: General or Specific QSAR

- $K_{oc}$  prediction with 'general' QSAR
  - Triazoles represented less than 2% of the training set chemicals
  - Therefore, little structural and experimental information on triazoles was included
  - Suggestion for further research: comparison between uncertainties in predictions calculated by 'general' or 'specific' QSARs → quantify impact on MPEs



### ■ Limitations: Predictions of Biodegradation

- Biodegradation half-lives in water were predicted with EPI Suite & Aronson et al.
  - important contributor to overall uncertainty!
- Biodegradation in soil and sediment were extrapolated from water
  - equal rates with uncertain extrapolation factor
- But... current guidance indicates that the half live in soil is 2 x as long as in water
  - If degradation is indeed slower, the MPEs are overestimated



## ■ Limitations: PNEC

- PNEC was based on assessment factor method

- 3 species only!

Are *O. Mykiss*, *D. Magna*, and *P. Subcapitata* a representative sample?

- Alternative: statistical extrapolation  
In that case sample size is highly relevant





### ■ Conclusion

The main sources of uncertainty in the triazoles' MPE were:

- the uncertainty in the biodegradation rate in water
- the uncertainty in the extrapolation factor used to predict biodegradation in soil from biodegradation in water
- the uncertainty in the QSAR for soil sorption partitioning



The reliability of the MPE predictions for triazoles can be improved particularly by including experimental data for biodegradation and sorption to soil



**Thank you for your attention!**



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