



**AFRL**

# Assessment of Acute Oral Toxicity for Mixtures Using *In Silico* Modeling Methods

**Presented May 27, 2021**

**Public Meeting of the Interagency Coordinating Committee on Validation of Alternative Methods**

**Work Performed by Slava Chushak, PhD and Jeffery Gearhart, PhD**

**Presented by Matthew W. Linakis, PhD**

**US Air Force Research Laboratory 711<sup>th</sup> Human Performance Wing,**

**Wright-Patterson Air Force Base, Ohio USA**

**matthew.linakis.1@us.af.mil**

# Disclaimers

- Opinions are those of the presenter, and not those of the Air Force, or the Department of Defense (DOD).

# Outline

- Background
- Objectives
- Approach
- Results
  - Analysis of Input Data
  - Predictions of GHS acute oral toxicity category
- Challenges
- Impact and Conclusions
- Acknowledgements

# Objectives

- While exposure of humans to environmental hazards often occurs with chemical mixtures, the majority of existing toxicity data and tools are for single compounds
  - This is particularly pertinent given the number of unique AF-relevant mixtures used across the force.
- Therefore, our researchers evaluated the prediction of GHS acute oral toxicity category for mixtures using the additivity formula and toxicological data collected in the Integrated Chemical Environment (ICE)

# Approach

- By using available experimental data for individual ingredients, our researchers were able to calculate a GHS category for only half of the mixtures.
- The Collaborative Acute Toxicity Modeling Suite (CATMoS) was used to predict LD<sub>50</sub> values for active ingredients without available experimental data.

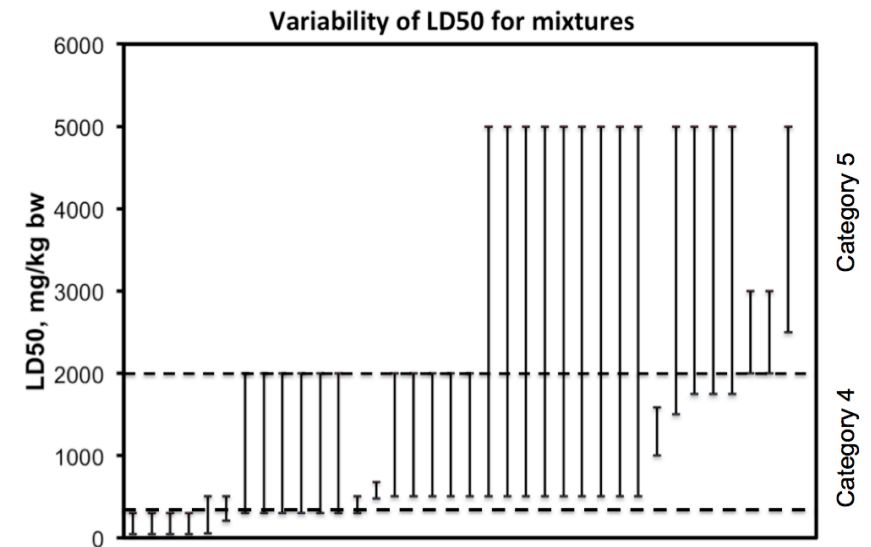
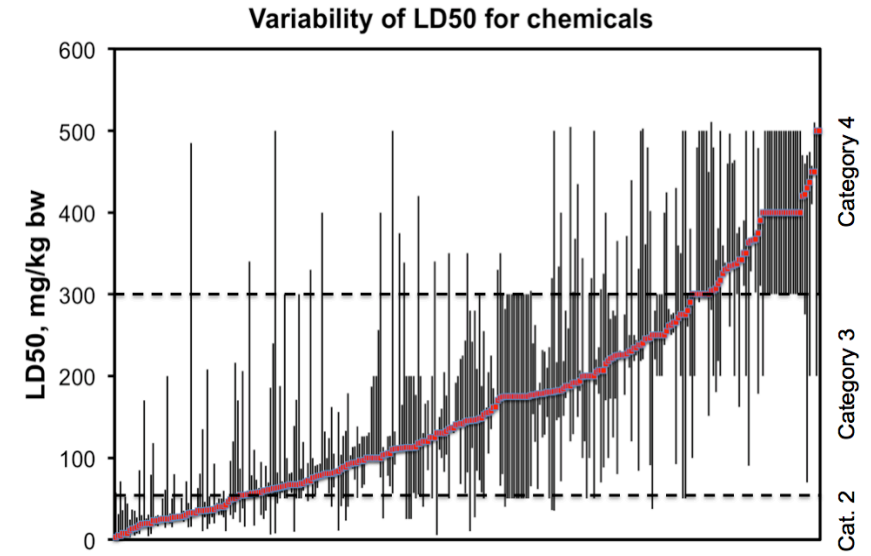
Exposure route	Category 1	Category 2	Category 3	Category 4	Category 5
<b>Oral</b> (mg/kg bodyweight) <i>See notes (a) and (b)</i>	5	50	300	2000	5000 <i>See detailed criteria in Note (g)</i>
<b>Dermal</b> (mg/kg bodyweight) <i>See notes (a) and (b)</i>	50	200	1000	2000	
<b>Gases</b> (ppmV) <i>See notes (a), (b) and (c)</i>	100	500	2500	20000	<i>See detailed criteria in Note (g)</i>
<b>Vapours</b> (mg/l) <i>See notes (a), (b), (c), (d) and (e)</i>	0.5	2.0	10	20	
<b>Dusts and Mists</b> (mg/l) <i>See notes (a), (b), (c) and (f)</i>	0.05	0.5	1.0	5	

*Note: Gases concentration are expressed in parts per million per volume (ppmV).*

Source: UN GHS Purple Book

# Results: Analysis of Input Data

- Variability of Input Data
  - Out of 10,384 chemicals in the ICE repository, 1,417 chemicals have 2 or more LD<sub>50</sub> values, with 514 chemicals falling into 2 or more GHS categories
  - Variability of experimental data is also observed for mixtures



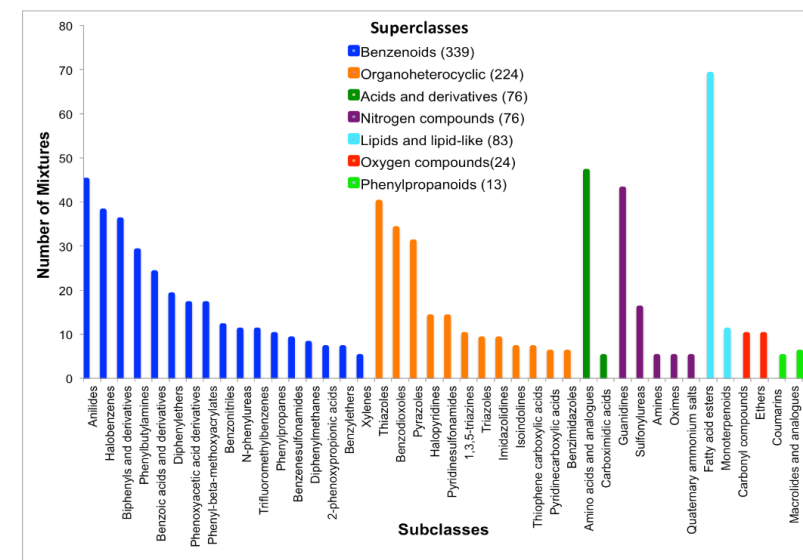
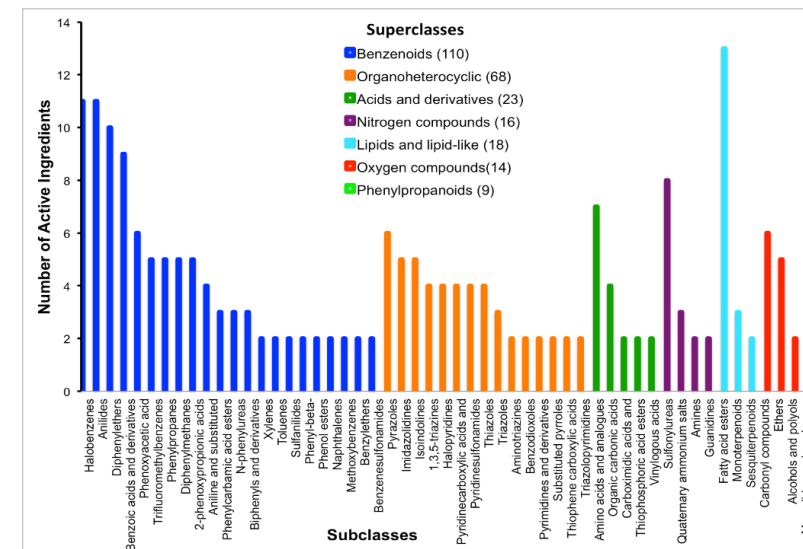
# Results: Analysis of Input Data cont'd

## • Structure-based classification (chemicals)

- 13 fatty acid esters
- 12 pyrethroids
- 11 halobenzenes
- 11 anilides

## • Structure-based classification (mixtures)

- 69 contain pyrethroids
- 43 are guanidines containing imidacloprid or dinotefuran



# Results: Predictions of GHS Acute Oral Toxicity Category

		Predicted GHS Category					Total	SEN	SPE
		1	2	3	4	5			
ICE GHS Category	1	0	0	0	0	0	0		
	2	1	0	1	0	0	2	0	1.00
	3	0	1	16	7	1	25	0.64	0.96
	4	0	0	8	54	37	99	0.55	0.91
	5	0	0	1	9	136	146	0.93	0.70
							272	0.53	0.89

Accuracy = 76 %    MCC = 0.56

Overestimated	20 = 7.4 %
Underestimated	46 = 16.9 %

		Predicted GHS Category					Total	SEN	SPE
		1	2	3	4	5			
ICE GHS Category	1	0	0	0	0	0	0		
	2	1	0	1	0	0	2	0	0.98
	3	0	1	20	4	0	25	0.80	0.93
	4	0	4	13	59	23	99	0.60	0.82
	5	0	0	3	28	115	146	0.79	0.82
							272	0.55	0.89

Accuracy = 71 %    MCC = 0.51

Overestimated	50 = 18.4 %
Underestimated	28 = 10.3 %

Predictions using the “median” LD<sub>50</sub> values for active ingredients

Predictions using the “low” LD<sub>50</sub> values for active ingredients



# Results: Predictions of GHS Acute Oral Toxicity Category cont'd

		Predicted GHS Category					Total	SEN	SPE
		1	2	3	4	5			
ICE GHS Category	1	0	0	0	0	0	0		
	2	1	0	1	0	0	2	0	1.00
	3	0	0	19	4	0	23	0.83	0.96
	4	0	1	6	62	24	93	0.67	0.84
	5	0	0	2	22	112	136	0.82	0.80
							254	0.58	0.90

Accuracy = 76 %    MCC = 0.58

	Overestimated	32 =12.6 %
	Underestimated	29 =11.4 %

Predictions using ICCVAM LD<sub>50</sub> values for ingredients

		Predicted GHS Category					Total	SEN	SPE
		1	2	3	4	5			
ICE GHS Category	1	0	0	0	0	0	0		
	2	1	0	1	0	0	2	0	1.00
	3	0	0	22	6	2	30	0.73	0.97
	4	0	1	8	85	47	141	0.60	0.80
	5	0	0	7	67	256	330	0.78	0.72
							503	0.53	0.87

Accuracy = 72 %    MCC = 0.46

	Overestimated	84 =16.7 %
	Underestimated	56 =11.1 %

Predictions using ICCVAM and predicted by CATMoS LD<sub>50</sub> values for ingredients

# Challenges

- The majority of mixtures in the ICE repository are agrochemical formulations that provide only the concentration of their active ingredients. However, inactive ingredients can change properties and the LD<sub>50</sub> value of active ingredients
- Variability and reproducibility of the experimental results for both mixtures and their ingredients play a significant role in the accuracy of prediction of GHS acute toxicity classification.
- In the current approach, CATMoS was used to predict the LD<sub>50</sub> values for ingredients without the experimental data. The application of several different *in silico* methods, such as QSAR and read-across, can improve the accuracy and reliability of predicted results.

## Impact and Conclusions

- The additivity formula was applied to predict the GHS acute oral toxicity category classification for mixtures collected in the Integrated Chemical Environment (ICE)
- Experimental and predicted CATMoS LD<sub>50</sub> values were used for active ingredients
- The predictions of GHS classification were made for 503 mixtures/formulations with 72% accuracy
- The structure-based analysis of the misclassified mixtures didn't identify any specific structural features associated with the mispredictions.
- Results demonstrate that CATMoS together with an additivity formula can be used to predict the GHS acute oral toxicity category for chemical mixtures

# Acknowledgements

- This effort was financially supported under the Virtual Airman Simulation (VAST) task
- AFRL contributors
  - Slava Chushak
  - Jeff Gearhart
  - Darrin Ott
- Reference: Chushak, Y., Gearhart, J. M., & Ott, D. (2021). “In Silico Assessment of Acute Oral Toxicity for Mixtures” Chem. Res. Toxicol. 34, 345.
- For more information, contact: Yaroslav Chushak, [ychushak@hjfresearch.org](mailto:yichushak@hjfresearch.org)



# Questions?