

### **ICH M7 Expert Review Workshop**

Resolving common prediction scenarios using automated arguments in Nexus 2.3

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# Agenda

- In silico workflow under ICH M7
- Features of expert review
  - Common prediction scenarios & expert review arguments
  - How Lhasa has approached this with Nexus 2.3
- Expert review workshop
  - Highlighting scenarios where Nexus 2.3 can help expert review



# In silico workflow under ICH M7





Regulatory Toxicology and Pharmacology Volume 67, Issue 1, October 2013, Pages 39-52



Use of *in silico* systems and expert knowledge for structure-based assessment of potentially mutagenic impurities

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Regulatory Toxicology and Pharmacology Volume 73, Issue 1, October 2015, Pages 367-377

### Establishing best practise in the application of expert review of mutagenicity under ICH M7 $\star$

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Regulatory Toxicology and Pharmacology Volume 102, March 2019, Pages 53-64 Regulatory Texticology an Pharmacology

Principles and procedures for handling out-ofdomain and indeterminate results as part of ICH M7 recommended (Q)SAR analyses \*

Alexander Amberg <sup>a</sup>, Roxanne V. Andaya <sup>b</sup>, Lennart T. Anger <sup>a</sup>, Chris Barber <sup>c</sup>, Lisa Beilke <sup>d</sup>, Joel Bercu <sup>e</sup>, Dave Bower <sup>f</sup>, Alessandro Brigo <sup>g</sup>, Zoryanna Cammerer <sup>h</sup>, Kevin P. Cross <sup>f</sup>, Laura Custer <sup>1</sup>, Krista Dobo<sup>j</sup>, Helga Gerets <sup>k</sup>, Véronique Gervais <sup>1</sup>, Susanne Glowienke <sup>m</sup>, Stephen Gomez <sup>n</sup>, Jacky Van Gompel <sup>o</sup>, James Harvey <sup>p</sup>..., Glenn J. Myatt <sup>f</sup> & 🛱



Regulatory Toxicology and Pharmacology Volume 71, Issue 2, March 2015, Pages 295-300



(Q)SAR assessments of potentially mutagenic impurities: A regulatory perspective on the utility of expert knowledge and data submission

Mark W. Powley 🖾





Regulatory Toxicology and Pharmacology Volume 77, June 2016, Pages 13-24

ELSEVIER



Principles and procedures for implementation of ICH M7 recommended (Q)SAR analyses 🖈

Alexander Amberg <sup>a</sup>, Lisa Beilke <sup>b</sup>, Joel Bercu <sup>c</sup>, Dave Bower <sup>d</sup>, Alessandro Brigo <sup>e</sup>, Kevin P. Cross <sup>d</sup>, Laura Custer <sup>f</sup>, Krista Dobo <sup>g</sup>, Eric Dowdy <sup>c</sup>, Kevin A. Ford <sup>b</sup>, Susanne Glowienke <sup>1</sup>, Jacky Van Gompel <sup>J</sup>, James Harvey <sup>k</sup>, Catrin Hasselgren <sup>d</sup>, Masamitsu Honma <sup>1</sup>, Robert Jolly <sup>m</sup>, Raymond Kemper <sup>n</sup>, Michelle Kenyon <sup>g</sup> ... Glenn J. Myatt <sup>d</sup> <sup>A</sup>



- ...required for *in silico* predictions under ICH M7 & is essential for each impurity that is processed
  - Used to ensure predictions are relevant & accurate
  - Used to conclude assessment of activity based on predictions
- ...often straightforward



"Derek & Sarah have both produced strong predictions for bacterial mutagenicity based on the same toxicophore & there is no reason to doubt these predictions. Therefore, we conclude this impurity is positive & assigned ICH M7 Class III."

2 predictions related to ICH M7 (for Mutagenicity in Bacterium) have been run for this structure.

~	Туре	Endpoint	Species	Result	Model					
ICH	ICH M7 Prediction									
M	Derek	Mutagenicity in vitro	bacterium		Derek KB 2020 1.0					
M	Sarah	Mutagenicity in vitro	bacterium	POSITIVE (64%)	Sarah Model - 2020.1					



- ...required for *in silico* predictions under ICH M7 & is essential for each impurity that is processed
  - Used to ensure predictions are relevant & accurate
  - Used to conclude assessment of activity based on predictions
- ...often straightforward, but some situations are harder to resolve
  - How do I conclude if Derek and Sarah disagree?
  - How do I find relevant information from the software to support my conclusion?
  - How do I document this in a concise way for a regulator?





**Establishing best practise in the application of expert review of mutagenicity under ICH M7** Regulatory Toxicology and Pharmacology 2015, 73, 367-377





NN = nearest neighbours

- ...required for *in silico* predictions under ICH M7 & is essential for each impurity that is processed
  - Used to ensure predictions are relevant & accurate
  - Used to conclude assessment of activity based on predictions
- ...often straightforward, but some situations are harder to resolve
  - How do I conclude if Derek and Sarah disagree?
  - How do I find relevant information from the software to support my conclusion?
  - How do I document this in a concise way for a regulator?
- ...often completed with recycled arguments for common prediction scenarios
  - How can I make expert review consistent and efficient to save time?



### Common arguments to resolve predictions

- Adequate Ames data is available
- Ames test does not assess the hazard caused by the compound class adequately
- Toxicophore identified by one system has not been adequately assessed by the other
- Toxicophore identified by one system is not causative of activity
- Toxicophore identified by one system is not negated by negative features
- Data available for nearest neighbours is not of sufficient quality to make prediction
- **?** Nearest neighbours are not adequately similar enough to make a prediction

61 arguments written for possible prediction scenarios



### Nexus 2.3 – selected arguments

In Silico Expert Review			
	In Silico Overall Call:	Positive (Calculated Call)	
Arguments Available	Argument Outcome	Arguments Used Argument Outcome	
26 - Toxicophore identified by Derek Nexus is also present in the Ames negative API in the same chemical environment and there are no additional toxicophores present All alerts identified by Derek Nexus for the query compound are also present in the API in the same chemical environment and no additional alerts are present in the query compound. The API has produced a negative result in the bacterial reverse mutation assay. As a result, an overall in silico prediction of negative can be made.	Negative	Following an ICH M7 prediction, the results from Derek & Sarah evaluated & arguments relevant to those predictions are presented	
Toxicophore(s) identified by both systems which cannot be adequately negated Sarah Nexus and Derek Nexus have made a positive prediction for the query compound. The predictions are and cannot be overruled. As a result, an overall in silico prediction of positive must be made.	Positive	the user, guiding the expert review process.	
	Positive	Add >>	
	Negative	The user may add their own custom arguments, for example if they have proprietary knowledge that is relevant to the review.	
		Finalise Review	



## Nexus 2.3 – selected arguments

In Silico Expert Review						
	In Silico Ov	erall Call:	Negative	~		
Arguments Available	Argument Out	come		Arguments Used Argument Outcome		
<b>36 - Toxicophore(s) identified by both systems which cannot be adequately negated</b> Both Sarah Nexus and Derek Nexus have made a positive prediction for the query compound. The predictions are valid and cannot be overruled. As a result, an overall in silico prediction of positive must be made.	Positive			26 - Toxicophore identified by Derek Nexus is also present in the Ames negative API in the same chemical environment and there are no additional toxicophores present       Negative         All alerts identified by Derek Nexus for the query compound are also present in the API in the same chemical environment and no additional alerts are present in the query compound. The API has produced a negative result in the bacterial reverse mutation assay. As a result, an overall in silico prediction of negative can be made.       Negative		
	Positiv	Whe	en argu	uments are selected, the in silico overall call is automatically		
·		upd	ated to	reflect these selections.		
^	Negative		Add >>			
×			<< Remove			
When the user has completed their review of the predictions, they can tick the finalis review check box which highlights the review has been completed & prevents furth changes to the selected arguments & <i>in silico</i> overall call.						
				Finalise Review		



# Nexus 2.3 – integrating Derek & Sarah



When an ICH M7 prediction is run, specific information relating to Derek & Sarah is highlighted in the Sarah prediction results:

- Do the Sarah training examples activate Derek mutagenicity *in vitro* alerts?
- Do the Sarah hypotheses relate to any activated Derek mutagenicity in vitro alerts?
- Have the Sarah training examples which are non-mutagenic been tested in the most appropriate strains?



### **Worked examples**









# **Review high level predictions**

ICH

?

Expert

M7





## Review the expert prediction

MICH M7 Prediction-2

Prediction Navigator

Derek

Expert

M7



No misclassified or unclassified features raises no doubt in the negative prediction made by Derek.



## Review the statistical prediction



## Review the statistical prediction



Compound is a known non-mutagen in the Sarah training set & has been tested adequately, hence there is no reason to disagree with this negative prediction. In addition, aromatic amines with strong electron withdrawing groups such as SO<sub>2</sub> are excluded from Derek aromatic amine alerts.

### **Expert review**





- Inactive prediction has no misclassified or unclassified features that would reduce confidence in the prediction
- Alert comments discuss sulfones inactivating aromatic amines

 Compound is a known non-mutagen in the Sarah training set that has been tested adequately



### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



### ICH M7 classification





#### Class 5



There is no reason to doubt either prediction & compound is a known non-mutagen that has been adequately tested.

# Example 2





# **Review high level predictions**





## Review the expert prediction

	🐗 ICH M7 Prediction-3 😑 Sarah 🜔 Derek 🛛 😁	🗆 🕛 Alert Details 🥶 EC3 😨 Reasoning Explorer 🛛 🚺 Prediction Constraints	- <u>D</u>
		Mutagenicity in vitro is INACTIVE Overview No microsofied or unclassified features	Similar Compound
?		Details The query structure does not match any structural alerts or examples for (bacterial in vitro) mutagenicity in Derek. Additionally, the query structure does not contain any unclassified or misclassified features and is consequently predicted to be inactive in the bacterial in vitro (Ames) mutagenicity test.	No misclassified or unclassifie features are identified, suggesting ther is high confidence in the negativ
		Nearest neighbours Most similar compounds search is available only when misclassified features are present.	prediction.
	Click above to view the original structure		Not available for prediction.
Expert Review	A Derek KB 2020 1.0 (Certified by: Lhasa Limited, Leeds, Yorkshire, UK)     Vi Mutagenicity in vitro     S bacterium - INACTIVE     No misclassified or unclassified features		
M7 classification			
o misclassified or unc	lassified features raises no doubt in the nega	tive prediction made by Derek.	

## Review the statistical prediction



Derek symbol shows whether Derek alerts activated by the training set example are due to the hypothesis (e.g. amide) or an alternative toxicophore (e.g. aromatic amine).

Exclamation mark symbol highlights that all Derek alerts activated by the example are for toxicophores different to the hypothesis. Therefore, removal of these examples would result in a negative prediction being made by Sarah.



Although Sarah provides a positive prediction, the positive hypothesis is a result of training set examples demonstrating activity as a result of activating features which are not in the query compound or hypothesis. Removal of these examples instead results in a negative prediction being made.

### **Expert review**





 Inactive prediction has no misclassified or unclassified features that would reduce confidence in the prediction

- Positive prediction is supported by 1 hypothesis, although it is an overruled negative hypothesis & overall confidence is relatively low (15%)
  - Mutagens in the training set are active due to activating groups not present in the query compound & their removal from prediction gives a negative prediction



### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



## ICH M7 classification



#### Class 5

The positive prediction made by Sarah is based on compounds which have different toxicophores & match different Derek alerts to the query compound, hence it is reasonable to overrule & accept the negative prediction made by Derek.



# Example 3





# **Review high level predictions**





## Review the expert prediction



The restriction of bis-ortho-substituted aromatic amines where a substituent is "large" does not exclude the 2,6-dimethylphenyl, it warrants additional review into this positive activity predicted by Derek as it may considered a near miss for the exclusion.

## Review the statistical prediction



Limited

There are several compounds similar to the query in Sarah which assess the aromatic amine identified by Derek as well as the piperazine. Moreover, the most similar examples are similar to the query so it is reasonable to consider this to be an acceptable negative prediction.

### **Expert review**

Derek

PLAUSIBLE

?

Expert

**Review** 

M7





• Comments discuss exclusion of aromatic amines with bis-*ortho*-substituents where one is not "small", hence this may be considered a near-miss for this exclusion



Sarah

- Negative prediction with good confidence is supported by 3 hypotheses
  - Several similar examples which are relevant to use for read-across



### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



### ICH M7 classification





#### Class 5

Positive prediction made by Derek details an exclusion for which the query is a near-miss, reducing confidence in the prediction. The similarity & relevance of non-mutagens in Sarah support overturning the Derek prediction.


# Example 4





# **Review high level predictions**



ICH WI7 Summary Results					
2 predictions related to ICH M7 (for Mutagenicity in Ba	cterium) have been i	un for this stru	cture.		
Type Endpoint	Species	Result		Model	
CH M7 Prediction-3					Derek & Sarah
Derek Mutagenicity in vitro	bacterium			Derek KB 2020 1.0	disagree
3 Sarah Mutagenicity in vitro	bacterium		NEGATIVE (32%)	Sarah Model - 2020.1	
n Silico Expert Review	In Silico Overa	ll Call: Positiv	e (Calculated Call) 🗸		
Arguments Available	Argument Outcome	^	Arguments Used	Argument Outcome	
11 - Toxicophore identified by Derek Nexus has not been adequately assessed by Sarah Nexus At least one alert identified by Derek Nexus does not correspond to a related hypothesis in Sarah Nexus and has not been adequately assessed by Sarah Nexus. As a result, an overall in silico prediction of positive must be made.	Positive		Derek be a p	the equivocal result warr ositive result with low conf	I rants analysis as it's considered t fidence.
38 - Adequate negative Ames test data from Sarah Nexus additional information used to overrule prediction The query compound is an exact match with a compound present in the additional information supplied with the Sarah Nexus training set. An overall call could not automatically be assigned for this compound but review of the available data indicates it produces negative results in the Ames test. As a result, an overall in silico prediction of negative can be made.	Negative	Add >>	Sarah inform review	example compounds, i ation tab which are not us red to ascertain relevance	including those in the addition sed by the hypothesis, need to b e to the toxicophore identified b
39 - Adequate positive Ames test data from Sarah Nexus additional information used to overrule prediction The query compound is an exact match with a compound present in the additional information supplied with the Sarah Nexus training set. An overall call could not a automatically be assigned for this compound but review of the available data indicates it produces positive results in the Ames test. As a result, an overall in silico prediction of positive must be made.	Positive	< Remo	Derek	-	
41 - Toxicophore(s) identified by Derek Nexus can be adequately negated by most similar compounds in Sarah Nexus Sarah Nexus has produced a negative prediction overall and no positive hypotheses have been identified for the query compound. The most similar compounds to the	Negative				Lhasa

### Review the expert prediction

	🔯 ICH M7 Prediction-3 🜔 Derek 🛱 🤤 Sarah 🖓 🗖	🕕 Alert Details 🛛 💷 EC	3 🎡 Reasoning Explorer 🚺 Prediction Constraints			
Derek		307: N-Methylol co	ompound or precursor			^
nexus ? ? D Expert Review	'Alert 307' selected, click above to view the original structure         'Prediction Navigator         Show predictions of at least:         EQUIVOCAL         'Show predictions of at least:         'Show predictions of at least:         EQUIVOCAL         'Show predictions of at least:         'Show predictions of at least:         EQUIVOCAL         'Show predictions of at least:         'Show predic		m the identification of the N-methylol group (toxicophor tests are frequently not obtained [Overton et al 1986, Ashb hethylol group and these have also been included. Aroxymethyl-N-carbazole which tested positive in Salmon ethylmelamine (HEMLA) [Ashby et al 1985a] which tested incentrations of metabolic activation (30% 59). 4-Chloro- mant and Ashby], chloroacetamide N-methylol to the ar atives [Ashby et al 1985b, Ames et al, Lander et al). For the termediate [Sarrif et al, Ashby et al 1985b]. However, alter of electrophilic methyleneiminium or methyleneimine spe the ing [Ames et al, Over et al 1985]. DNA cross-link in described [Ames et al, Coley et al]. Conjugation of the i me allow this alternative mechanism to occur. Studies of the termechanism is unclear and the level of binding low [Ash	$ \begin{aligned} &                                  $	e results in A HMPA) says) or in timurium vorted for ia an fLA and its and rease their of the	Comments highlight methylols exhibit weak activity in Ames test; however, results are inconsistent. Mechanistic discussion suggests mechanism requires metabolism to formaldehyde which reacts with DNA. Therefore, activity is dependent on (1) the ability of metabolic system used & (2) weak mutagenicity of formaldehyde as ultimate mutagen.
		Mutagenicity: Ames test	t		^	Moderate (56%) PPV for
		The alert has demonstra	ated the following predictive performance:			alert suggests chemical
M7		<ol> <li>Proprietary data set 1:</li> <li>Proprietary data set 2:</li> <li>FDA CFSAN data set:</li> </ol>	: 1 compound activates this alert of which 0 are reported : 0 compounds activate this alert 9 compounds activate this alert of which 5 are reported p	positive (positive predictivity: 0%) ositive (positive predictivity: 56%)		class expected to have
classification			· · ·			mixture of activity.
		✓ Endpoints	Name	Darent		, ,
		4086	Mutagenicity	Mutagenicity (ALL)		

Limited

Alert comments suggest methylols are weakly mutagenic as they require metabolism to formaldehyde which is a weak mutagen itself. Therefore, it is necessary for the Ames test protocol to use a metabolic system that is competent otherwise it may be that the Ames test is not suitable for this class, which is consistent with the inconsistent results observed. It is reasonable to treat this as a positive, albeit one that warrants further review.



Sarah identifies 4 hypotheses; however, none are for the *N*-methylol specifically. There is a non-mutagenic *N*-methylol in the training set which is relevant & provides confidence in the negative prediction.





The impurity is in the additional information tab in the Sarah training set as it has been rejected for having a conflicted call. There is no strain information available to help any potential resolution.



#### **Expert review**





- Matches alert for *N*-methylol
- Comments suggest chemical class is expected to be weakly mutagenic & inconsistent results may be obtained in the Ames test due to metabolic incapability & the fact that formaldehyde, the ultimate mutagenic species, is weakly mutagenic itself

- Negative prediction is made & supported by 4 hypotheses, although none are specifically for the N-methylol functional group
  - Training set includes a negative example that may be used for read-across; however, the query itself is in the additional information tab showing conflicted or equivocal activity



### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



### ICH M7 classification





#### Class 3

There is low confidence in the positive prediction by Derek; however, Sarah has not specifically assessed the *N*-methylol functionality & there is conflicting results for the query itself in the training set. There is not enough evidence to support the negative prediction made by Sarah & it is advised to test, although it is important to consider the Ames test may require certain protocols to confirm (in)activity for this class.



# Example 5





# **Review high level predictions**





## Review the expert prediction

	1 ICH M7 Prediction-3	🕕 Alert Details 🛛 📧	EC3 🎡 Reasoning Explorer D Prediction Constraints			
🚺 Derek		027: Alkylating a	agent			^ ·
nexus		Alert Matches				
?		✓ Description Image	$R_{1} = CI, Br, I, OS(=0)_{n}R4$ R1 = CI, Br, I, OS(=0)_{n}R4 R2, R3 = any (with exclusions - R4 = any except OH, NH2, CF3 n = 1, 2	as specified in alert description)		
Expert Review	'Alert 027' selected, click above to view the original structure         Image: Prediction Navigator         Show predictions of at least:         EQUIVOCAL         ✓         Perek KB 2020 1.0 [Certified by: Lhasa Limited, Leeds, Yorkshire, UK]         ✓	<ul> <li>Comments</li> <li>This alett describes th alkyl sulphinates, successful to a descrator, howe attributed to the extra biphenyl compound chloromethylpyrene also been reported to The following structure.</li> </ul>	ie genotoxicity of alkylating agents where the carbon bearing the function phonates and sulphates [Ian et al]. trophilic species that are capable of directly alkylating DNA. Consequently, typhinurium strains TA100 and TA1535 (Barber et al, Eriksson et al]. In ger y reported for n-butyl chloride [Barber et al, Zeiger et al 1987] and n-dodee al]. Shorter chain alkyl chloride such as methyl chloride [Andrews et al], et e mutagenic. idence to suggest that the mutagenicity of some benzyl halides may not b at high doses. Benzyl chloride has been reported weakly mutagenic but on ver, strong activity is observed in both the presence and absence of S9 mix a stability of the benzyl cation and formation of unstable DNA adducts whi s stability of the benzyl cation and formation of unstable DNA adducts whi souch as 4-(chloromethyl)bilphenyl [Ashby et al 1981, Timema and Callan [Ball and Young] do give strong positive responses in the Ames test despite be mutagenic in the Ames test. ral classes are excluded from the alert:	al group is a primary or secondary alkyl carbon atom. In addition to alkyl halides, it many compounds are mutagenic in the Ames test in the presence and absence of eral, alkyl chlorides are less mutagenic than their bromo and iodo counterparts, an yl chloride [Zeiger et al 1992]. longer chain alkyl chlorides may not give a positive ro hyl chloride [Zeiger et al 1992] and 2-propyl chloride [Eriksson et al, Simmon et al] ; e observed in the Ames test [Ball et al]. This may be due, in part, to their high cytoti y in the presence of S9 mix [Zeiger Hal 1987]. When the test bacteria are exposed 1 (Simmon]. For secondary benzyl halides, the lack of a mutagenic response has be ch spontaneously cleave prior to replication [Ball and Young]. In contrast, correspo et al and polyanomatic compounds such as 2-chloromethyl)pyridine [Claxton of their toxicity. Heterocyclic analogues, such as 2-(chloromethyl)pyridine [Claxton of	ncludes	Comments provide good evidence of activity for benzyl chlorides & compound does not match any of the listed exclusions in the alert.
M7		Mutagenicity: Ames The alert has demons 1) Proprietary data se 2) Proprietary data se 3) FDA CFSAN data s	test trated the following predictive performance: t 1: 151 compounds activate this alert of which 68 are reported positive (pc t 2: 6 compounds activate this alert of which 3 are reported positive (pc tet 437 compounds activate this alert of which 345 are reported positive (pc	sitive predictivity: 45%) re predictivity: 50%) sitive predictivity: 79%)	Ŷ	Moderate (45%) to good (79%) PPV for alert.
classification		▼ Endpoints				
		ID ⇒ 4086	Name Mutagenicity	Parent Mutagenicity (ALL)		

\_imited

Derek provides a positive prediction with plausible level of reasoning which has good evidence of activity for this chemical class & has good PPV in validation, hence good confidence in the prediction.



Sarah provides a negative prediction with good confidence (44%) & 4/5 hypotheses are negative. However, the positive hypothesis is the aliphatic chloride which is the toxicophore identified by Derek in the compound & this is supported by several mutagenic benzyl chlorides. Therefore, the non-negating negative hypotheses are swamping the positive hypothesis & should be overruled.



#### **Expert review**





- Matches alert for alkylating agent for the benzyl chloride moiety
- Comments provide good evidence of activity for benzyl chlorides & compound does not match any of the listed exclusions in the alert

- Negative prediction with good confidence is supported by 4 negative hypotheses
  - 1 positive hypothesis for aliphatic chlorides contains several examples of mutagenic benzyl chlorides whereas the 4 negative hypotheses can be considered as non-negating features



### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



#### ICH M7 classification



#### Class 3

Positive prediction made by Derek & Sarah has identified the same toxicophore; however, in Sarah it has been swamped by non-negating features.



# Example 6





# **Review high level predictions**

M7



## Review the expert prediction



Derek provides a positive prediction with plausible level of reasoning which has good evidence of activity for this chemical class & has good PPV in validation, hence good confidence in the prediction.



The query is outside domain, although the specific feature (*N*-thio-*N*-sulfonyl) is not the same as the toxicophore identified by Derek (*N*-polyhaloalkylthio). Therefore, it would be possible to assess the activating feature if present in the training set examples; however, this is not the case. Alternative hypotheses identified by Sarah are supporting of activity for polyhaloalkyl compounds.



#### **Expert review**





- Matches alert for *N*-polyhaloalkylthio compound
- Comments provide good evidence of activity for *N*-polyhaloalkylthio compounds & multiple mechanisms are expected to contribute to genotoxicity

- Outside domain feature (*N*-thio-*N*-sulfonyl) prevents Sarah making a prediction
  - Outside domain feature is different to the toxicophore identified by Derek & there are no examples of *N*-polyhaloalkylthio compounds in the training set
  - Unable to conclude mutagenic potential of *N*-polyhaloalkylthio compounds but polyhaloalkyl compounds considered mutagenic



### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



## ICH M7 classification



#### Class 3

No prediction is made by Sarah as a feature is outside domain; however, this is not the same functional group as that identified by Derek. Sarah does not assess the same activating feature but does provide further evidence for polyhaloalkyl compounds being mutagenic. Although the query is outside Sarah's domain, the evidence presented does not give any reason to doubt the Derek prediction.





# Example 7





# **Review high level predictions**

2 predictions related to ICH M7 (for Mutagenicity in Bacterium) have been run for this structure.

Species Result

bacterium

hacterium

In Silico Overall Call:

Argument Outcome

Negative

Positive

Positive

INACTIVE \*

OUTSIDE DOMAIN

Inconclusive

Add >>

< < Remove

MICH M7 Summary Results



Derek & Sarah Inconclusive No prediction is made by Sarah

Derek: unclassified feature reduces confidence in negative prediction; however, it is still possible to review the compound & assess the mutagenic potential of this feature.

- -

Model

Derek KB 2020 1.0

Sarah Model - 2020.1

Sarah: no prediction is made as the query is outside domain; however, it is still possible to review the compound & assess whether this feature is likely to (dis)agree with the Derek prediction.





## Review the expert prediction

	🜃 ICH M7 Prediction-2 🚺 Derek 🕱 🗖 🗖	🕕 Alert Details 🥶 EC3 🎲 Reasoning Explorer 🕸 🚺 Prediction Constraints	- 8
🛯 🔰 Derek	Unclassified features	Mutagenicity in vitro is INACTIVE	Similar Compound
		Overview Contains unclassified features	
		Details	Upplagation facture (1.2 exething) is
		The query structure contains features (highlighted in the structure panel) that were not found in the Lhasa Ames test reference set and do not match	Unclassified feature (1,5-0xatinine) is
		any structural alerts or examples for (bacterial in vitro) mutagenicity in Derek, it is predicted to be inactive in the bacterial in vitro (Ames) mutagenicity test.	identified which reduces confidence in
			the negative prediction. This is still a
			valid negative prediction, albeit one
			with reduced confidence where expert
			review should focus on the mutagenic
		Nearest neighbours	potential of this feature to ensure
		Most similar compounds search is available only when misclassified features are present.	confidence in the prediciton
			confidence in the predictori.
	Click above to view the original structure		
	🗈 Prediction Navigator 🛛 🕀 🖻 🗎		Not available for
	Show predictions of at least: EQUIVOCAL		prediction.
Export.	Querek KB 2020 1.0 [Certified by: Lhasa Limited, Leeds, Yorkshire, UK]     Autagenicity in vitro		
Expert	✓ ⇒ bacterium - INACTIVE Contains undersified features		
Review	<ul> <li>Contains unclassified reatures</li> </ul>		
M7			
classification			

Derek provides a negative prediction; however, the 1,3-oxathiane is unclassified meaning that it is not present in the Lhasa Ames test reference set. This reduces confidence in the negative prediction & warrants further investigation.



"''''IIIH



Sarah identifies the aliphatic chain, which is obviously not associated with mutagenicity; however, Sarah provides no formal prediction as the 1,3oxathiane is outside domain.



"''IIIH

# **Review high level predictions**



Derek & Sarah

Agree





Finalise Review

# **Expert review**

Derek

INACTIVE \*

Expert Review

M7





- 1,3-Oxathiane is not present in the Lhasa Ames reference test set, reducing confidence in the negative prediction
- Opening the ring retains the (1-alkoxyethyl)(alkyl)sulfane function & returns an inactive prediction with no misclassified or unclassified features
- Prediction of metabolic pathways provided by Meteor does not suggest ring opening to release acetaldehyde, a suspected mutagen, is likely to occur



Outside domain feature is a (1-alkoxyethyl)(alkyl)sulfane contained in a ring system, hence opening the ring is a way to assess mutagenic potential in this scenario & Sarah returns a negative prediction although no example compounds specifically contain this feature



## Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

#### 3. Unsure



# ICH M7 classification



<ul> <li>Type</li> </ul>	Endpoint	Species	Result		Model	
ICH M7 Pred	diction-6					
🔯 Derek	Mutagenicity in vitro	bacterium	-		Derek KB 2	020 1.0
* Contains u	unclassified features					
😼 Sarah	Mutagenicity in vitro	bacterium	ou		Sarah Model	- 2020.1
In Silico	Expert Review					
		In Silico Overall	Call: Negative	~		
Argument	ts Available	Argument Outco	me	Arguments Used		Argument Outco
24 - Outs cannot b Sarah Ne structura outside ti been ider evidence pose a ha identified result, an made.	side domain feature identified by Sarah Nexus e dismissed as a potential toxicophore xus cannot make a prediction as at least one I feature present in the query compound is he domain of the model. No structural alerts have tiffied by Derek Nexus. However, available suggests that the out of domain feature may zzard or additional positive hypotheses have been I by Sarah Nexus that cannot be negated. As a overall in silico prediction of positive must be	Positive		23 - No toxicophore has system and the outside of Sarah Nexus does not pp Sarah Nexus cannot make structural feature present outside the applicability of structural alerts have been Available evidence sugge feature does not pose a h hypotheses have been ido result, an overall in silico made.	been identified by either domain feature identified by ose a hazard a a prediction as at least one in the query compound is lomain of the model. No in identified by Derek Nexus. sts that the out of domain azard and no additional positive entified by Sarah Nexus. As a prediction of negative can be	Negative
	~ ~	Positive	Add >> << Remove			
	^	Negative				

#### Class 5

In this instance, opening the ring system while retaining the (1-alkoxyethyl)(alkyl)sulfane function may be accepted as a method of addressing the unclassified & outside domain feature in Derek & Sarah respectively. In doing so, a negative prediction is returned. It is not expected that the compound will be active; however, as Sarah doesn't have any examples of the (1-alkoxyethyl)(alkyl)sulfane function, it may still be advisable to test.



"""IIIH







# **Review high level predictions**





2 predictions related to ICH M7 (for Mutagenicity in Ba	cterium) have been run	for this structure.		
<ul> <li>Type Endpoint</li> </ul>	Species Res	ault	Model	
ICH M7 Prediction-7				Derek & Sarah
🕡 Derek Mutagenicity in vitro	bacterium	EQUIVOCAL	Derek KB 2020 1.0	disagree
🕼 Sarah Mutagenicity in vitro	bacterium	NEGATIVE (79%)	Sarah Model - 2020.1	
In Silico Expert Review				
	In Silico Overall Ca	all: Positive (Calculated Call) ∨		
Arguments Available	Argument Outcome	Arguments Used	Argument Outcome	
<ol> <li>A mes test cannot adequately assess hazard of query compound</li> <li>The Ames test is not appropriate to measure the hazard of the compound class to which the query compound belongs (as described in the alert comments of alert 315 in Derek Nexus). As a result, an accurate overall in silico prediction cannot be derived.</li> <li>Toxicophore identified by Derek Nexus has not been adequately assessed by Sarah Nexus</li> </ol>	Inconclusive	Derek be a argum	the equivocal result warr positive result with low pent questions the reliab	ants analysis as it's considered confidence & the expert revie
At least one alert identified by Derek Nexus does not correspond to a related hypothesis in Sarah Nexus and has not been adequately assessed by Sarah Nexus. As a result, an overall in silico prediction of positive must be	Positive	carbo	xylic acid halide.	Sincy of the Atheo test for the
At least one alert identified by Derek Nexus does not correspond to a related hypothesis in Sarah Nexus and has not been adequately assessed by Sarah Nexus. As a result, an overall in silico prediction of positive must be made. <b>38 - Adequate negative Ames test data from Sarah</b> <b>Nexus additional information used to overrule</b> <b>prediction</b> The query compound is an exact match with a compound present in the additional information supplied with the Sarah Nexus training set. An overall call could not automatically be assigned for this compound but review of the available data indicates it produces negative results in the Ames test. As a result, an overall in silico prediction of negative can be made.	Positive	Add >> << Remove	xylic acid halide. T 79% confidence show tion & notes Ames data is onal information tab to revie	rs good confidence in negative available for the compound in the even

## Review the expert prediction



Limited

Derek provides a positive prediction for the carboxylic acid halide; however, the alert is set at the equivocal level of reasoning as there is evidence for & against so it requires review. The alert comments detail that activity is often dependent on the choice of solvent, hence carboxylic acid halides require review on a case by case basis. It is reasonable to consider the positive prediction with low confidence.



Many similar carboxylic acid halides in the Sarah training set are non-mutagenic, providing confidence in the prediction; however, based on Derek comments, full review of the test protocols is required.



	🌆 ICH M7 Prediction-7 😝 Sarah 🖄 🚺 Derek 🖆 🗖	Results Additional Information (48) 🕅						e	
For the 'Mutagenicity in vitro' endpoint the prediction is: NEGATIVE with 79% confidence	Show: All compounds $\sim$ Strain The compounds below are being shown for additional information. They were not used in the prediction but have a similarity to the query compound of 30% or higher.								
		Contributions references – – – × Source: Acid Halide Mutagenicity Dataset Source activity call: Conflicted Previous Next Dataset Call: Conflicted Structure ID: CAS RN® 141-75-3 Rejected Reason: Unmapped (1) Amberg A, Harvey JS, Czich A, Spirkl HP, Robinson S, White A, Elder DP, Organic Process Research and Development, 2015, 19, 1495-1506							Query is in the additional information tab with conflicted results as it has been reported to be positive & negative when tested in DMSO. It has not been tested in alternative solvents to
		Systematic name	CAS RN.	Structure	Vehicle	Ames result	Reference	A.,	assess these results.
		Butanoyl chloride	141-75-3		DMSO	->+	4, 7	elow to view the original	
M7 classification	Click above to view the original structure  Prediction Constraints  Co				Cor	• (	Copy references	genicity Dataset icted 11-75-3 ped all Table ve 11-75-3 ped ity Dataset	
		1			Cop	by references from a		tive 1-75-3 ped	¥

asa

Limited

Query has been reported as positive & negative in the Ames test, albeit having only been tested in DMSO. Considering the comments in Derek, it is likely that the positive result is a result of formation of CDMS; however, this cannot be concluded without testing in other solvents simultaneously.

#### **Expert review**





- Matches alert for carboxylic acid ester
- Comments discuss fact that activity is expected to be dependent on the solvent used as reaction with DMSO yields the expected mutagen CDMS whereas water hydrolyses the carboxylic acid halide

• Compound is known to Sarah training set; however, it is not included as conflicted results have been obtained using DMSO & no tests in other solvents are available to resolve this


### Please make your selection



- 1. Class 3 Alerting structure
- 2. Class 5 No alerts or alerting with sufficient data to demonstrate lack of mutagenicity

### 3. Unsure



## ICH M7 classification



- -

Model

1 - Ames test cannot adequately assess hazard of query

The Ames test is not appropriate to measure the hazard of

belongs (as described in the alert comments of alert 315 in

the compound class to which the query compound

Derek Nexus). As a result, an accurate overall in silico

Derek KB 2020 1.0

Sarah Model - 2020.1

Argument Outcome

Inconclusive



#### Unclassified

Based on available evidence & conflicted results for the compound, it is not possible to conclude mutagenic potential. There is reason to doubt the activity of carboxylic acid halides in the Ames test; however, they contain a functional group that could potentially react with DNA. Alternatively, it is considered they may be hydrolysed rapidly & present no concern. It is also possible that their reactivity results in purge during synthesis allowing control under section 8 of ICH M7 instead.

ICH M7 Summary Results

Type Endpoint

🚾 Derek Mutagenicity in vitro

Marah Mutagenicity in vitro

In Silico Expert Review

11 - Toxicophore identified by Derek Nexus has not

At least one alert identified by Derek Nexus does not

correspond to a related hypothesis in Sarah Nexus and

has not been adequately assessed by Sarah Nexus. As a

result, an overall in silico prediction of positive must be

38 - Adequate negative Ames test data from Sarah Nexus additional information used to overrule

supplied with the Sarah Nexus training set. An overall call could not automatically be assigned for this compound but review of the available data indicates it produces negative results in the Ames test. As a result.

an overall in silico prediction of negative can be made.

39 - Adequate positive Ames test data from Sarah Nexus additional information used to overrule

The query compound is an exact match with a

compound present in the additional information

call could not automatically be assigned for this compound but review of the available data indicates it produces positive results in the Ames test. As a result,

supplied with the Sarah Nexus training set. An overall

The query compound is an exact match with a compound present in the additional information

been adequately assessed by Sarah Nexus

Arguments Available

made.

prediction

prediction

CH M7 Prediction

2 predictions related to ICH M7 (for Mutagenicity in Bacterium) have been run for this structure.

Species Result

bacterium

bacterium

Argument Outcome

Positive

Negative

Positive

In Silico Overall Call: Inconclusive

Add >>

<< Remove

EQUIVOCAL

NEGATIVE (79%)

Arguments Used

prediction cannot be derived.

compound



## Conclusions

- In silico predictions under ICH M7 require, & benefit from, expert review
- Expert review varies for each prediction scenario
  - ...but some scenarios are more frequent & common arguments can be applied
- Scientific knowledge from multiple disciplines is required for expert review
- Expert review will be aided by...
  - ... understanding how *in silico* predictions work
  - ...understanding activity of specific chemical classes in the Ames test
  - ...making associations between different models more visible
  - ...presenting likely arguments to guide areas requiring review





# Thank you

#### shared **knowledge** • shared **progress**

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