# Mutagenic impurities: predicting alerting structures using *in silico* tools

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Leaders in the development of expert chemoinformatic systems and trusted curators of proprietary data.

### **About Lhasa Limited**

- Not-for-profit company and educational charity
- Established 1983, headquarters in Leeds















### **About Lhasa Limited**

- Not-for-profit company and educational charity
- Established 1983, headquarters in Leeds
- Purpose is to facilitate data and knowledge sharing in chemistry and the life sciences
- Develops database and *in silico* prediction systems
- Worldwide membership including academia, government agencies and industry

# **Lhasa Limited Products**

Derek Nexus - Toxicity Prediction in Mammals and Bacteria



Meteor Nexus - Predicts the Metabolic Fate of Chemicals in Mammals



Vitic Nexus - Chemically Intelligent Toxicity Database



Zeneth - Predicting Forced Chemical Degradation Pathways



Sarah Nexus - (Q)SAR methodology to predict mutagenicity

**Mirabilis** - Assesses the relative purging of synthetic impurities

### Summary

- Why are alerts sufficient to identify (or rule out) mutagenic impurities?
  - What evidence supports their usage?
- Using two complementary in silico systems
  - Expert and statistical
- The importance of expert review
- How in silico systems can assist further



### INTERNATIONAL CONFERENCE ON HARMONISATION OF TECHNICAL REQUIREMENTS FOR REGISTRATION OF PHARMACEUTICALS FOR HUMAN USE

ICH HARMONISED TRIPARTITE GUIDELINE

### Assessment and Control of DNA Reactive (Mutagenic) Impurities in Pharmaceuticals to Limit Potential Carcinogenic Risk

M7

Current Step 4 version

dated 23 June 2014

# SAR Analysis in ICH M7

### 6. HAZARD ASSESSMENT ELEMENTS

Hazard assessment involves an initial analysis of actual and potential impurities by conducting database and literature searches for carcinogenicity and bacterial mutagenicity data in order to classify them as Class 1, 2, or 5 according to Table 1. If data for such a classification are not available, an assessment of Structure-Activity Relationships (SAR) that focuses on bacterial mutagenicity predictions should be performed. This could lead to a classification into Class 3, 4, or 5.



### Acceptance of in silico mutagenicity predictions

- The hazard posed by mutagens has been wellcharacterised
- Exposure (and therefore risk) are relatively low
  - Impurities are present at low levels in pharmaceutical formulations

### Hazard

 Mutagenicity is generally driven by a well understood molecular initiating event (MIE)



• Observed in a robust, reliable *in vitro* assay system (bacterial reverse mutation assay, aka the Ames test)

### **Predicting Hazard**



polycarcinogen

C(X)<sub>4</sub> <sup>t</sup> X= H, F, CI, Br, I (*in any combination*)

### Tennant and Ashby

### **Predictive performance**

- The performance of *in silico* mutagenicity models varies by data set
- Generally, models can predict data in public domain, but often struggle to predict proprietary data
  - Assisted by using proprietary data in models



# Predictive performance for pharmaceutical impurities

 Impurities are more like well-predicted public compounds (than poorly predicted APIs)



### Two systems required, one expert, one statistical

A computational toxicology assessment should be performed using (Q)SAR methodologies that predict the outcome of a bacterial mutagenicity assay (Ref. 6). Two (Q)SAR prediction methodologies that complement each other should be applied. One methodology should be expert rule-based and the second methodology should be statistical-based. (Q)SAR models utilizing these prediction methodologies should follow

### **Expert and statistical systems**



# Commonly used in silico mutagenicity models

	Expert	Statistical
Lhasa	Derek nexus	Sarah
Leadscope	Genetox Expert Alerts Suite	Non-human Genetic Toxicity Suite
MultiCASE	<b>GT_EXPERT</b>	GT1_A7B GT1_AT_ECOLI PHARM_SALM PHARM_ECOLI

Sutter 2013

# Using two systems

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### Using two systems



### **Expert system**



### **Expert system**

#### Comments

Many aromatic amines exhibit mutagenicity in the Ames test, notably in Salmonella typhimurium strains TA98 and TA100 in the presence, but not absence, of S9 mix [Debnath et al, Benigni et al 1998, Benigni et al 1994]. The mechanism of action is generally considered to involve N-hydroxylation, typically mediated by cytochrome P450 1A2, and subsequent O-esterification [Colvin et al]. The resulting esterified product may then give rise to a reactive nitrenium ion which is capable of binding to cellular nucleophiles such as DNA.

Secondary aromatic amides may likewise exhibit activity in the Ames test in Salmonella typhimurium strains TA98 and TA100 in the presence of S9 mix [Trieff et al]. In such cases, deacylation of the amide may take place prior to N-hydroxylation.

The basis for the structural restrictions of the current alert may be summarised as follows:

1. Although non-polycyclic aromatic amines generally exhibit a lower mutagenic potency than polycyclic aromatic amines [Benigni et al 1998], a literature survey suggests that polysubstituted anilines with at least one free ortho position are generally mutagenic in the Ames test [Kugler-Steigmeier et al]. Aromatic amides are in general less mutagenic than their corresponding primary aromatic amines, possibly as a result of the need for initial N-deacylation to take place prior to N-hydroxylation [Trieff et al].

2. In order for secondary or tertiary aromatic amines to exhibit mutagenic activity, N-dealkylation must first occur in order to allow bioactivation of the amine to take place [Lai et al]. It has been demonstrated that N-methyl and N-ethyl substituents are more readily cleaved by N-dealkylation than larger alkyl groups [Testa], and it is therefore assumed that secondary and tertiary aromatic amines which bear such small alkyl substituents are more readily cleaved by N-dealkylation than larger alkyl groups [Testa], and it is therefore assumed that secondary and tertiary aromatic amines which bear such small alkyl substituents are more likely to exhibit mutagenic activity than those in which larger N-alkyl substituents are present. This is consistent with the view of Ashby and Tennant that aromatic amines with N-alkyl substituents of three or more carbons in size should not be considered structurally alerting for DNA reactivity [Ashby and Tennant]. In addition to saturated methyl and ethyl groups, small unsaturated substituents such as allyl and propargyl are also readily removed by N-dealkylation [Testa], and are therefore also considered within the scope of the alert. It should be noted that by restricting the substituent types permitted on the aromatic amine nitrogen in this way, structures in which the aromatic amine nitrogen is contained within a ring are effectively discounted. This is supported by several reports of aromatic amine mutagenicity which has been reduced or eliminated by confining the aromatic amine nitrogen to a ring [Ashby et al 1983, Ashby et al 1982].





#### References

ID	Title	Author	-
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471	Chemical structure, Salmonella mutagenicity and extent	Ashby J and Tennant RW.	
474	Genotoxicity of aniline derivatives in various short-term t	Kugler-Steigmeier ME, Friederich U, Graf U, L	
475	Evaluation of two suggested methods of deactivating or	Ashby J, Paton D, Lefevre PA, Styles JA and R	
475	Aromatic amines and acetamides in Salmonella typhimu	Trieff NM, Biagi GL, Ramanujam VMS, Conno	
492	Monooxygenase-catalyzed N-C cleavage.	Testa B.	
492	Cancer risk reduction through mechanism-based moleci	Lai DY, Woo YT, Argus MF and Arcos JC.	
493	Cyclic amines as less mutagenic replacements for dimet	Ashby J, Paton D and Lefevre PA.	
500	A QSAR investigation of the role of hydrophobicity in rec	Debnath AK, Debnath G, Shusterman AJ and	
501	QSAR models for both mutagenic potency and activity: a	Benigni R, Andreoli C and Giuliani A.	
501	OSAR models for discriminating between mutagenic and	Renigni R Passerini L Gallo G Giorgi F and C	Ψ.

### **Statistical results**



### **Statistical results**





### **Possible outcomes from Sarah Nexus**



### **Combining two systems**



O.O.D. = out of domain

### Barber et al



### Expert review of in silico predictions

- M7 guidelines
  - "If warranted, the outcome of any computer system-based analysis can be reviewed with the use of expert knowledge.."
- We recommend that you always do some review....
  - Be guided by the software and your knowledge...
    - Use confidence measures if they are proven to indicate accuracy
    - Use software that is transparent and highlights areas of concern
    - Use the expert commentary, mechanism and references
    - Look at relevant close examples from the models & databases
  - Depth of your analysis and the detail you report will vary
    - ... from a cursory analysis to a well-supported argument

### **Combining two systems**



O.O.D. = out of domain

### Example – propyl triazoline

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		🥳 Sarah Mutage	nicity in vitro	bacterium	NEGATIVE (20%)	Sarah Model - 1.1.19	
Jobs *							

### Example – propyl triazoline (Derek)





### Example – propyl triazoline (Sarah)



### Example – propyl triazoline analogue (Sarah)



### **Example – propyl triazoline conclusion**

💦 Nexus		
File Window Prediction Reports	Tools Help	
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Propyl triazoline     ICH M7 Prediction		ICH M7 Prediction
Derek Sarah		Derek Mutagenicity in vitro bacterium PL DOST Derek KB 2015 1.0
		Sarah Mutagenicity in vitro bacterium (20%) Sarah Model - 1.1.19
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## Summary so far

- Theoretical and empirical evidence supports the use of *in silico* toxicology tools for the genotoxicity risk assessment of pharmaceutical impurities
  - The usage is enshrined in ICH M7 guidance
- The guidance indicates that two complimentary tools should be used (with expert review, as required)
  - Increases probability that mutagens will not be missed
  - Leads to a multiplicity of outcomes
    - Human expert review becomes more important with higher levels
       of computational uncertainty

### **ICH M7 Classifications**

Class	Definition
1	Known mutagenic carcinogens.
2	Known mutagens with unknown carcinogenic potential (bacterial mutagenicity positive, no rodent carcinogenicity data).
3	Alerting structure, unrelated to the structure of the drug substance, no mutagenicity data.
4	Alerting structure, same alert in drug substance which have been tested and are non-mutagenic.
5	No structural alerts, or alerting structure with sufficient data to demonstrate lack of mutagenicity or carcinogenicity.



### **M7** Classification

http://www.ich.org/products/guidelines/multidisciplinary/article/multidisciplinary-guidelines.html

• M7 classification helps define how to control impurities...





### **Batch process against M7 settings**

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Status Structure	Name CAS No.	Derek Prediction	Sarah Prediction	QSAR Prediction	Similarity to API	Overall Carc.	Overall Ames	ICH M7 Class	Comments
	o Impurity1	INACTIVE: No misclassified or unclassified features	POSITIVE - 1%		No Derek Alerts found	Active	Conflicted	Class 3	
	> Impurity 2	INACTIVE: No misclassified or unclassified features	NEGATIVE - 41%		No Derek Alerts found	Unspecified	Unspecified	Class 5	
0 10	- Impurity 3	INACTIVE: No misclassified or unclassified features	EQUIVOCAL		No Derek Alerts found	Unspecified	Unspecified	Inconclusive	
•	• Impurity 4	PLAUSIBLE: Alert012 - Aliphatic nitro compound			All Alerts found in API	Unspecified	Unspecified	Class 4	



### ICH M7 class generated and report produced

Overall Carc.	Overall Ames	N I	ICH M7 Class
Active	Conflicted		Class 3
Unspecified	Unspecified		Class 5
Unspecified	Unspecified		Inconclusive
Unspecified	Unspecified		Class 4
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Unspecified	Unspecified	Unspecified	Unspecified
Unspecified	<b>Unspecified</b>	Unspecified	Unspecified
ex	Users can	also input al results f	or

Users can also input experimental results for mutagenicity or carcinogencity which updates the ICH M7 Class

## Conclusion

- Theoretical and empirical evidence supports the use of *in silico* toxicology tools for the genotoxicity risk assessment of pharmaceutical impurities
  - The usage is enshrined in ICH M7 guidance
- The guidance indicates that two complimentary tools should be used (with expert review, as required)
  - Increases probability that mutagens will not be missed
  - Leads to a multiplicity of outcomes that needs to be resolved by human expert
- The scope of these tools will increase to cover more of the workflow and assist expert review

### References

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