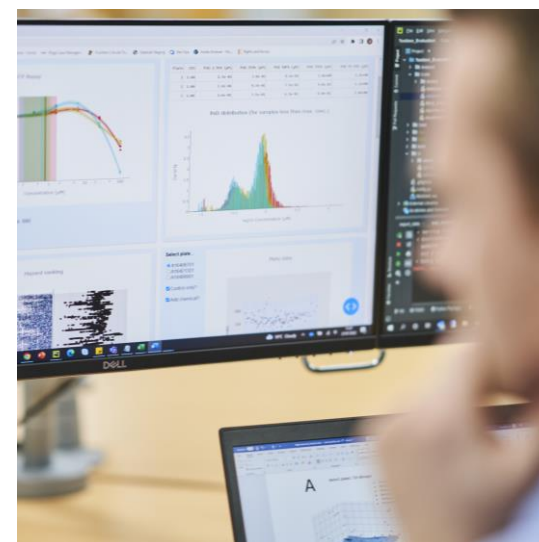


Application of Quantitative Systems Toxicology to support chemical safety assessment in the Cosmetics Industry

Andrew White and Alistair Middleton

Eurotox 2024: S18-02



Outline

- Drivers for Cosmetic Safety assessment
- Tiered testing Strategies and Exposure led safety assessment
NGRA
- Challenges and outcomes using case study examples
- Summary

Ensuring Safe Ingredients for Foods, Drinks, Homecare and Cosmetic Products (not drugs)

Risk Based Approach:

Considers both the hazard and the exposure to evaluate the risk

Can we safely use $x\%$ of ingredient y in product?

For **consumers; workers;**
the **environment**

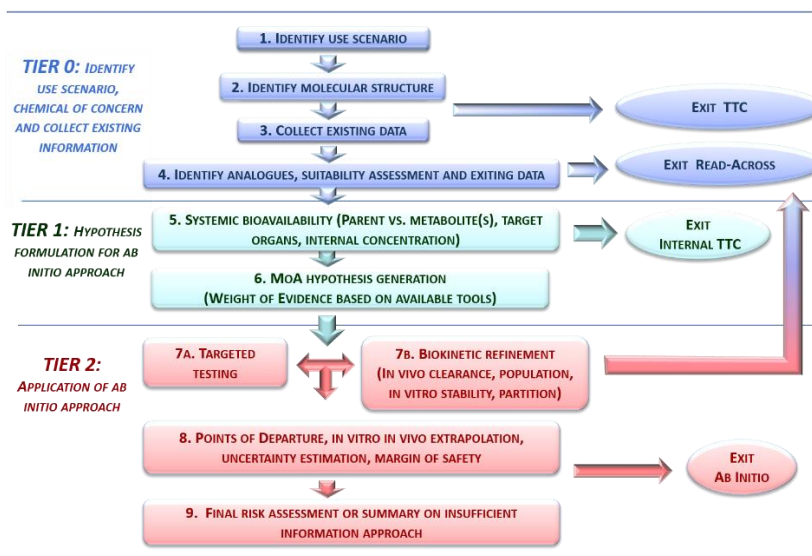


Decision frameworks in NGRA – Tiered approaches

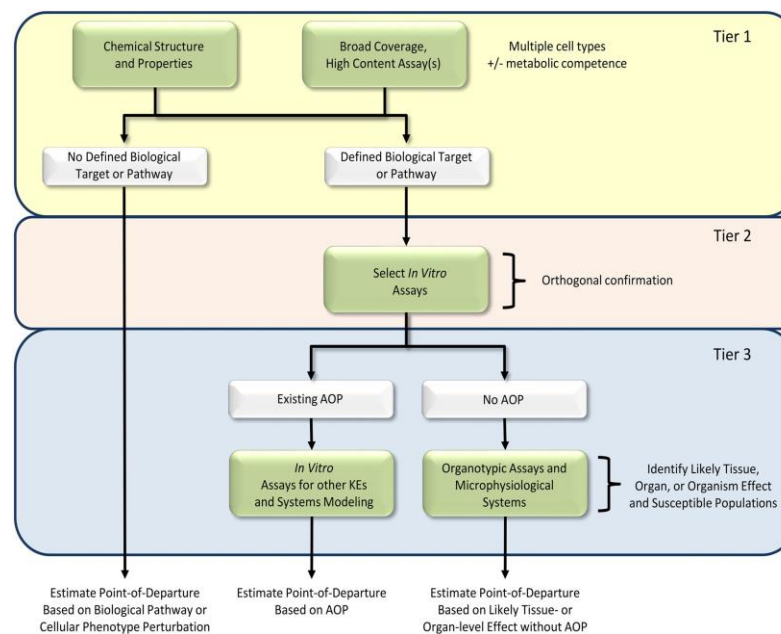
Problem formulation – Tier 0

Initial BER estimate – Tier 1

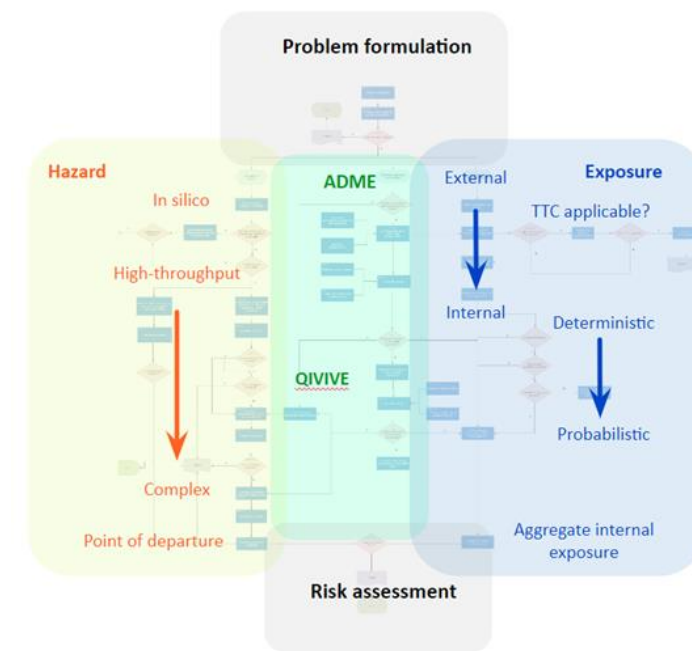
BER refinement – Tier 2



Berggren et al., 2017



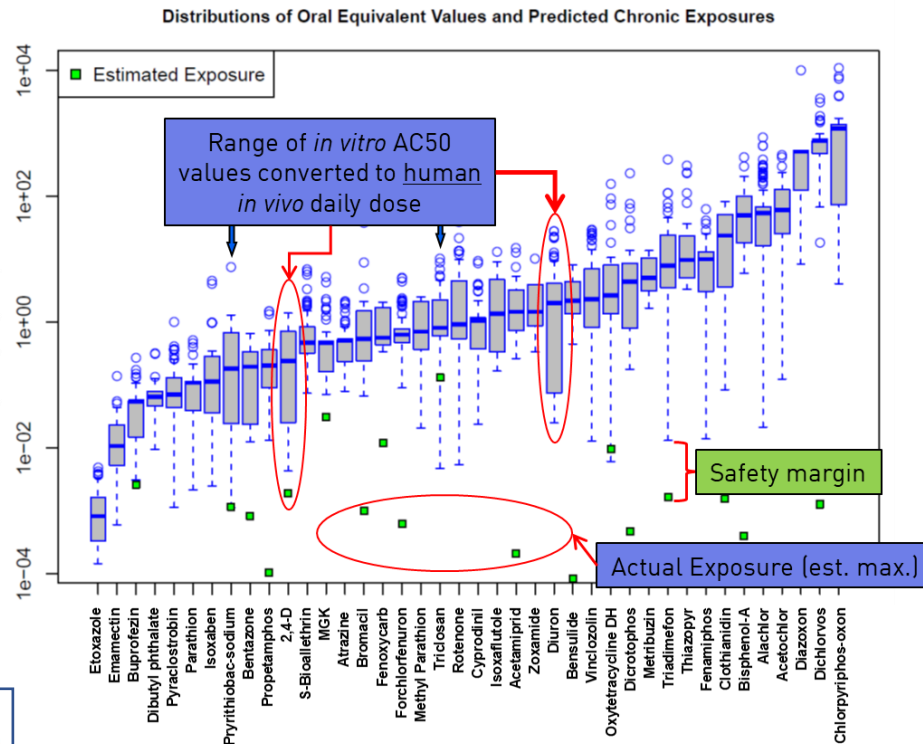
Thomas et al., 2019



ASPA ver 1.9

Safety without animal testing - Next Generation Risk Assessment (NGRA)

NGRA is defined as ***an exposure-led, hypothesis-driven risk assessment approach that integrates New Approach Methodologies (NAMs) to assure safety without the use of animal testing***



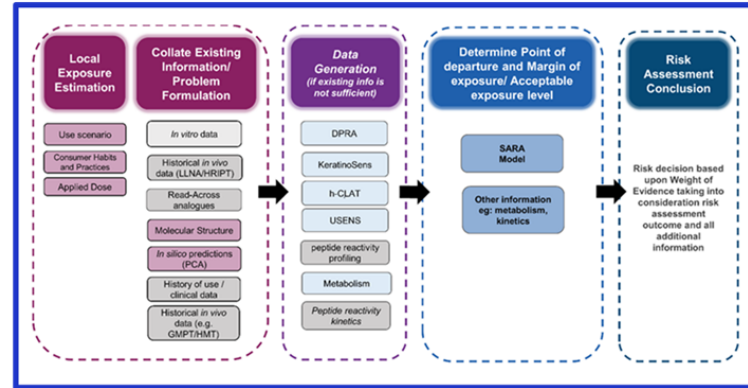
The hypothesis underpinning this type of NGRA is that **if there is no bioactivity observed at consumer-relevant concentrations, there can be no adverse health effects.**

Slide from Dr Rusty Thomas,
EPA, with thanks

Rotroff, et al. *Tox.Sci* 2010

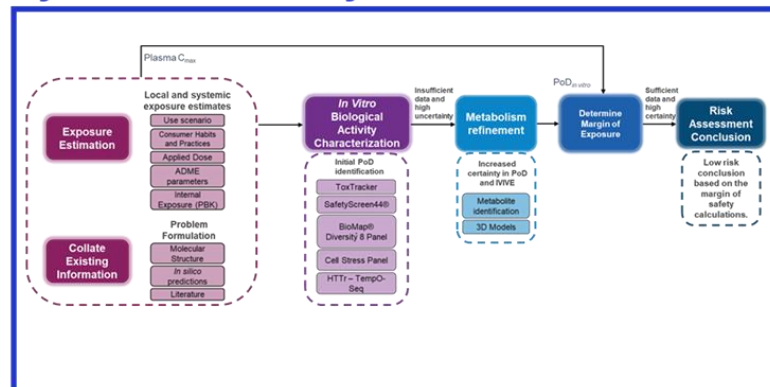
Application of NGRA case studies – Protection Goal

Skin Sensitisation



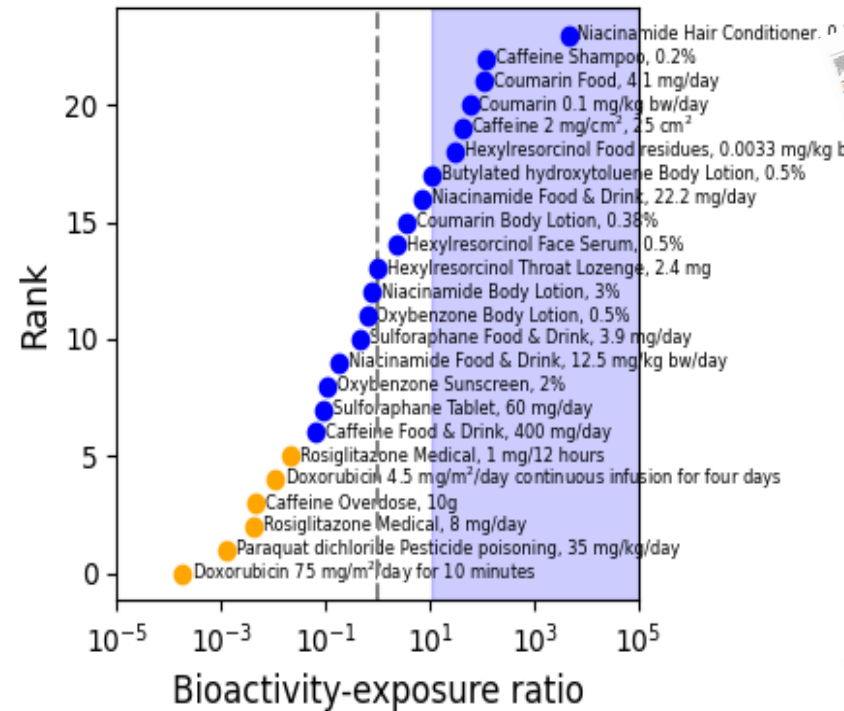
Reynolds et al (2021) Reg Tox Pharmacol, 127, 105075

Systemic safety



Baltazar et al., (2020) Tox Sci , Volume 176, Issue 1, Pages 236–252

PBK Level 2
Correlation with risk category: -0.76



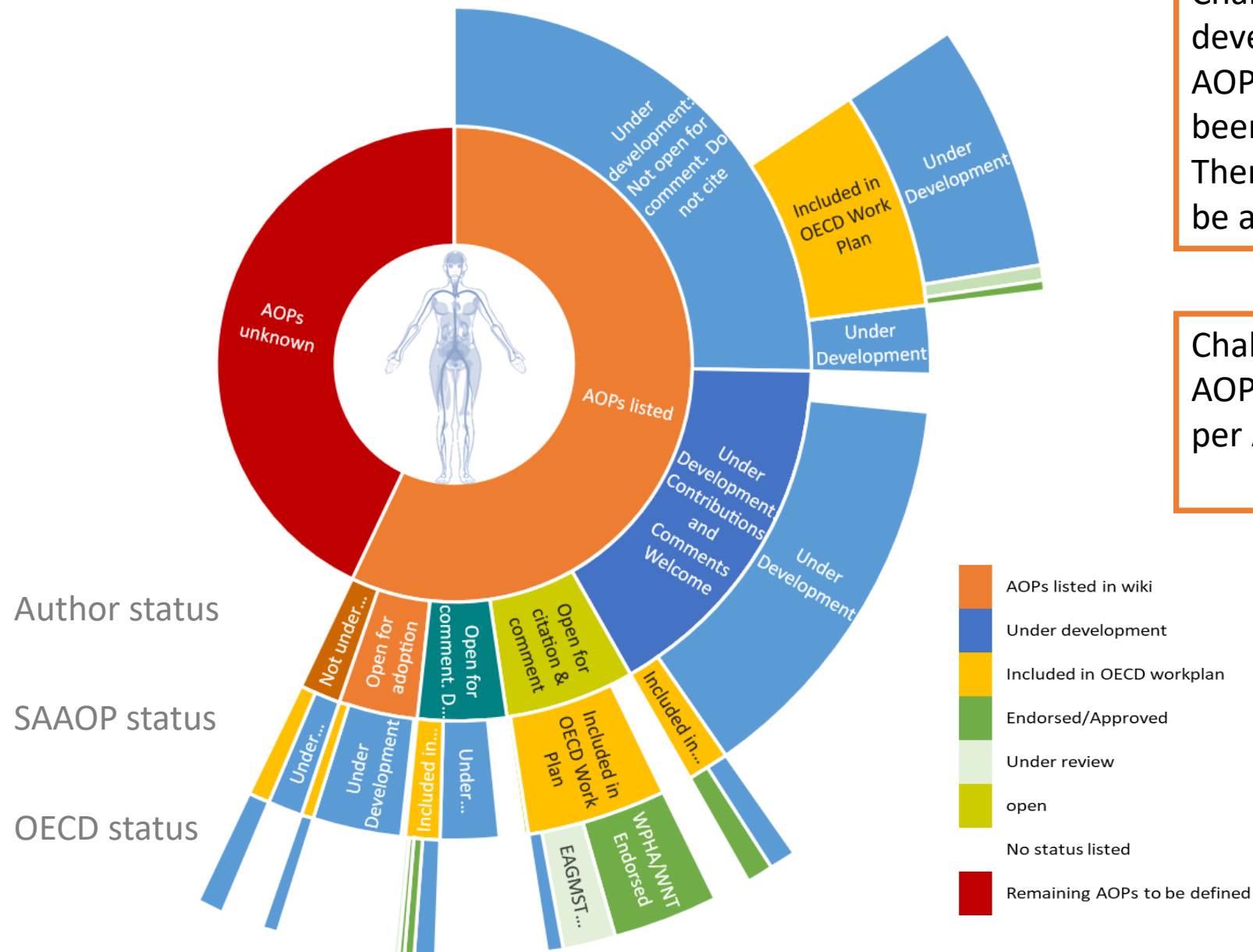
Blue: low risk chemical-exposure scenario

Yellow: high risk chemical-exposure scenario

Exposure scenarios within the blue shaded region are identified as low risk.



Current status of AOPs

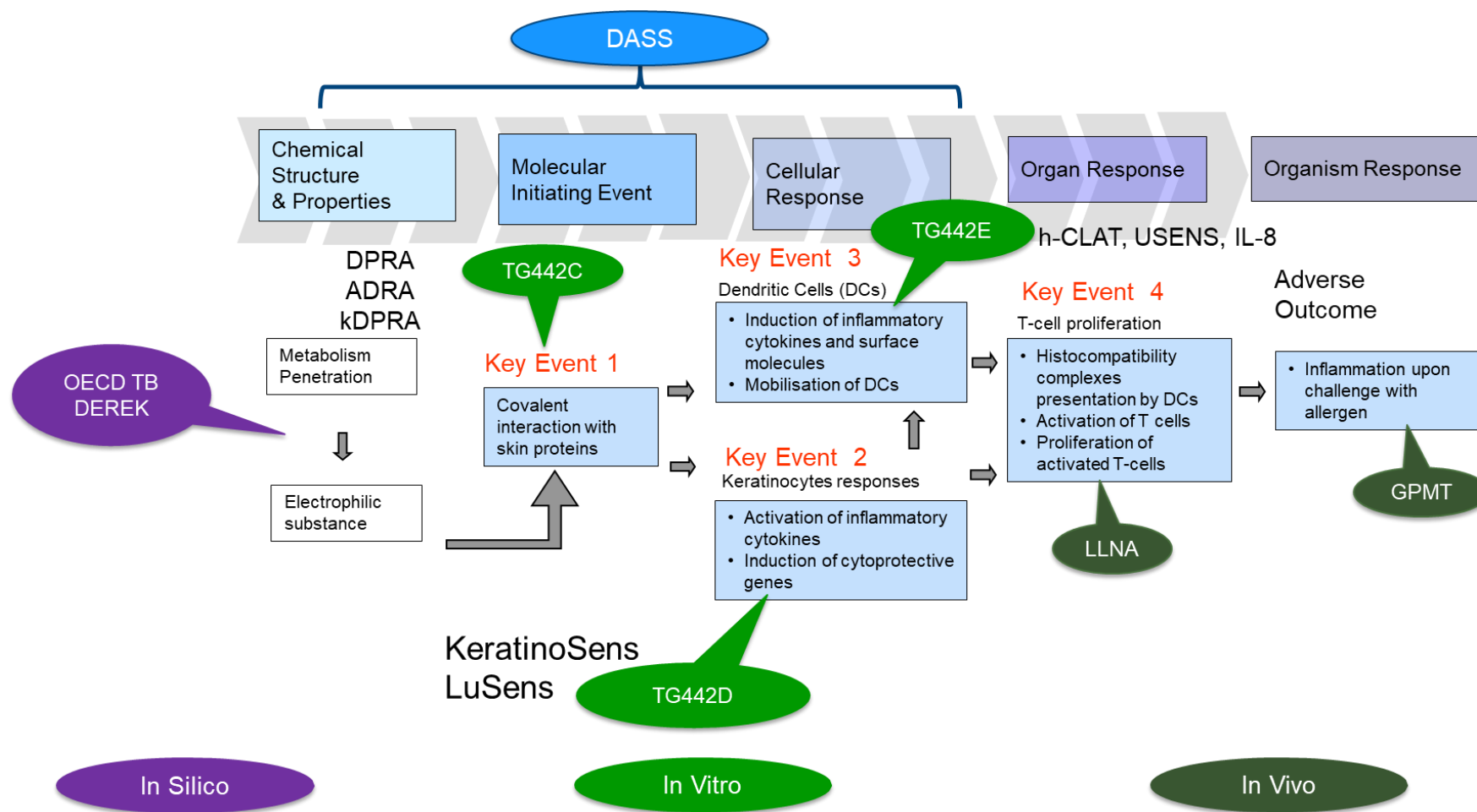


Challenge 1: After ~10 years of development, only limited number of AOPs, many of which have not yet been verified (biological coverage). There's an issue of scale that needs to be addressed.

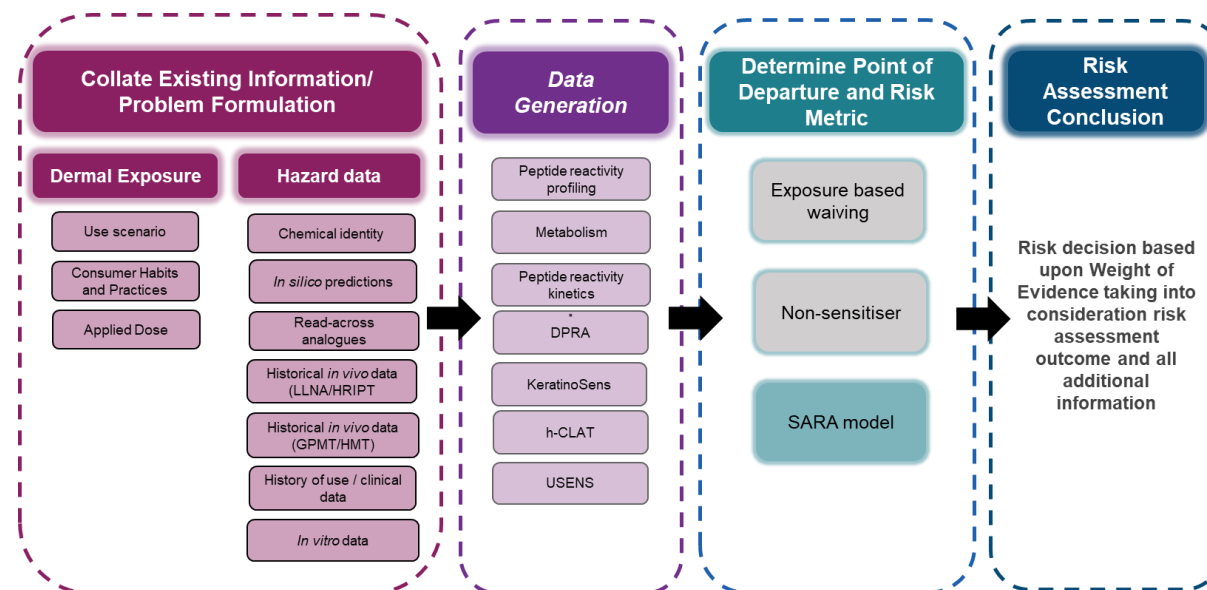
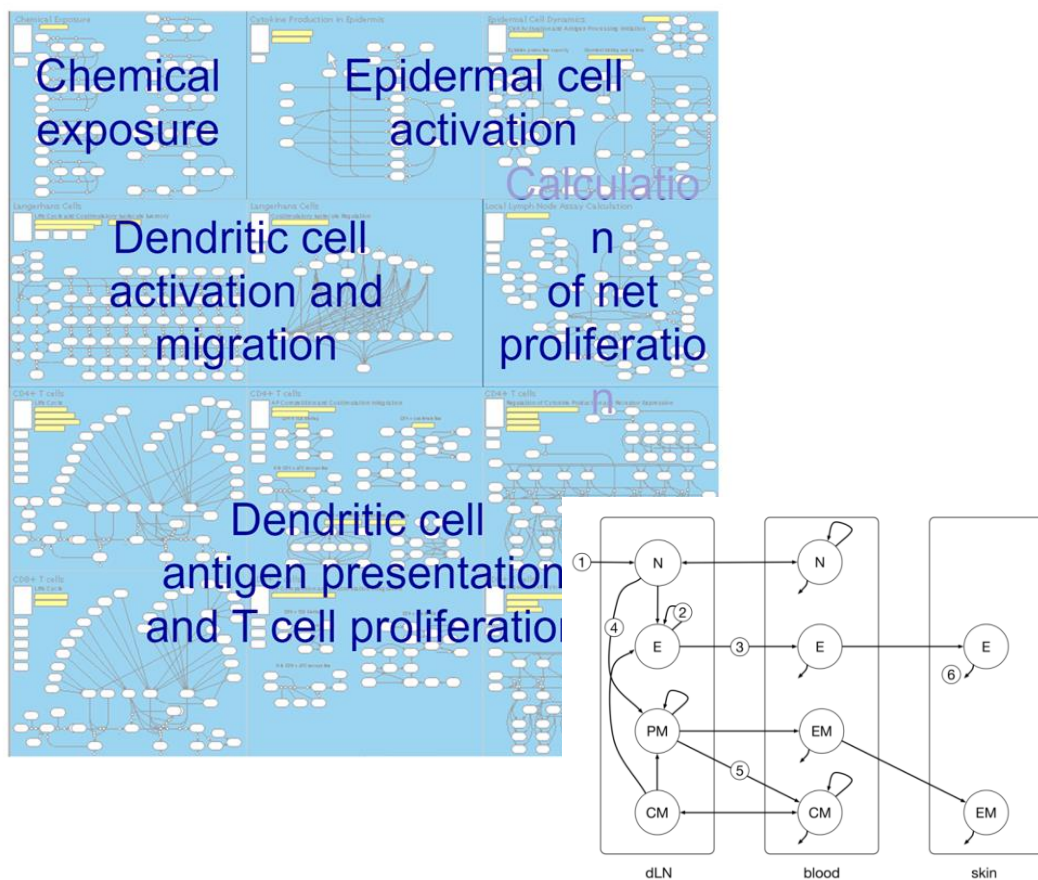
Challenge 2: At present there are 446 AOPs on AOP-Wiki. Assuming 5 KEs per AOP, that's over 2000 assays.
- Toxcast has ~ 700 assays

At present, a decision framework based only on AOPs is not feasible. However, AOPs can be used as a knowledge base for enhancing a testing strategy.

Case study 1. Skin allergy : AOP-informed testing strategy

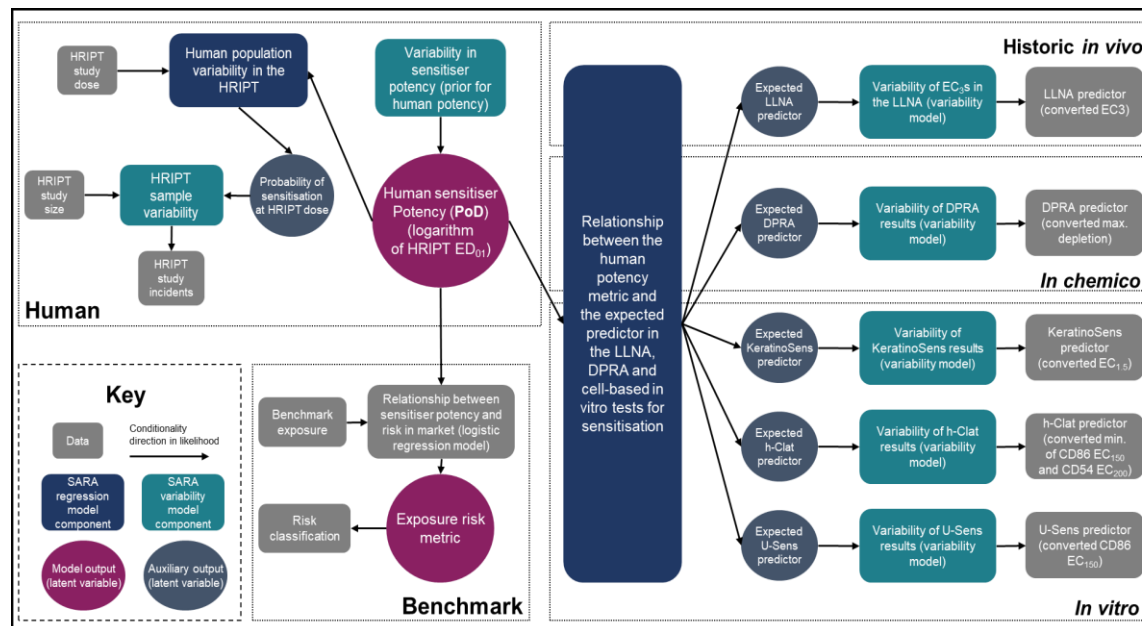


Evolution of approach towards quantitative model of Skin Allergy



- **Unilever NGRA framework for Skin Allergy** was designed to use a tiered WoE based upon all available information, accommodate range of consumer product exposure scenarios and provide a quantitative point of departure and risk metric → **SARA DA**

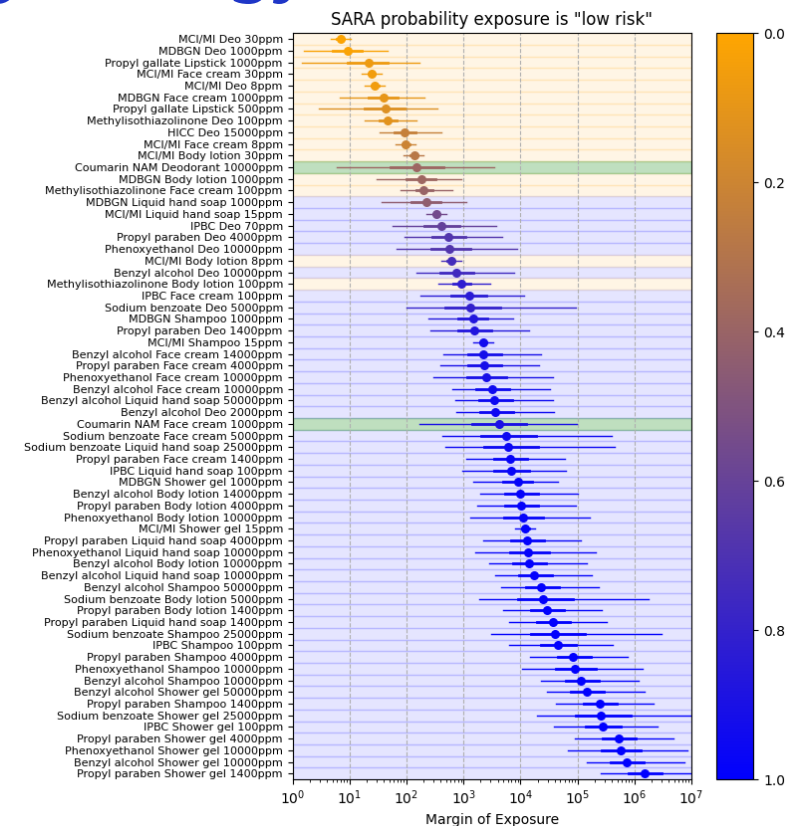
Skin allergy example: AOP-informed testing strategy



The use-case of the **SARA DA** is to estimate:

1. ED_{01} , the dose at which there is a 1% chance of sensitization in an HPPT-eligible population
2. Probability that a consumer exposure to some chemical is 'low risk', conditional on the available data and the model

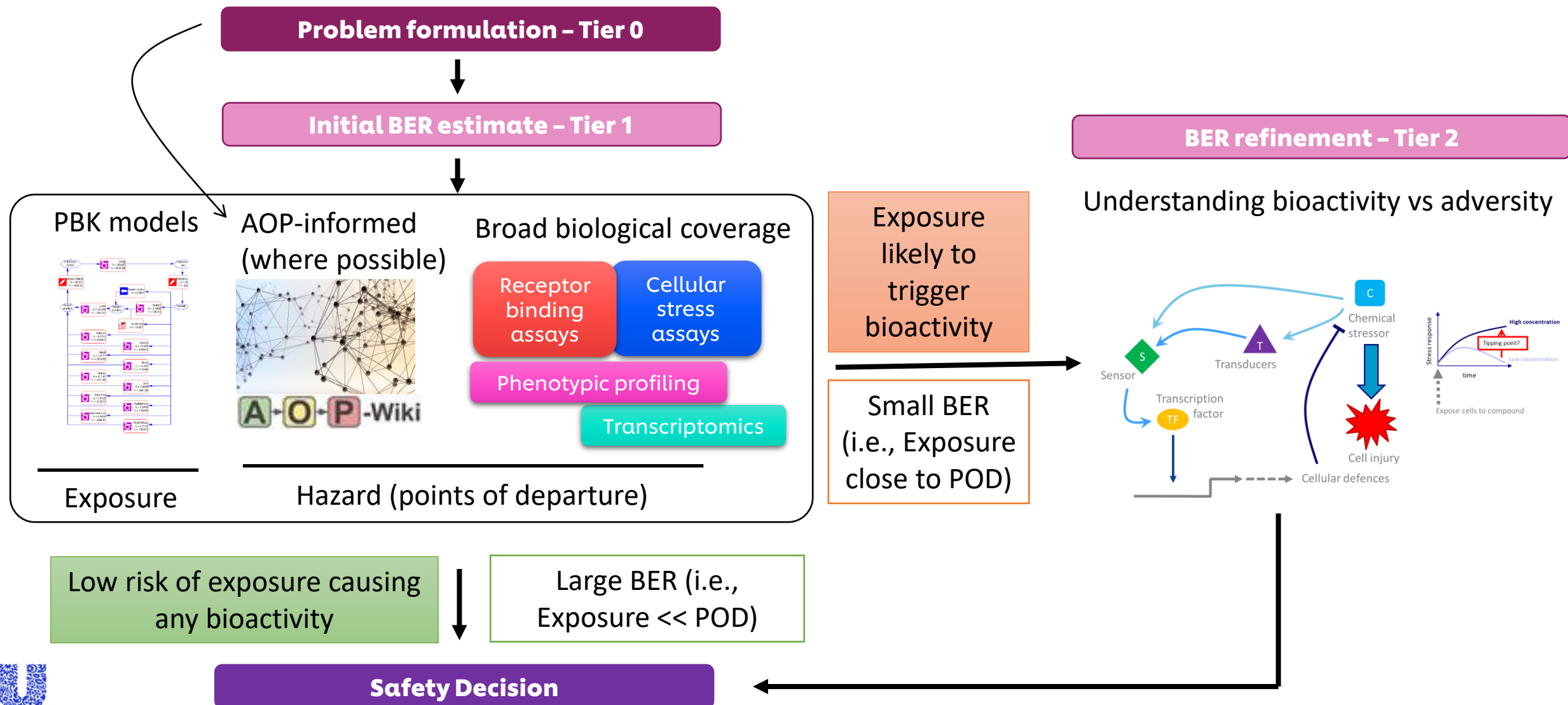
Reynolds et al 2022 <https://pubmed.ncbi.nlm.nih.gov/35835397/>



SARA: A Bayesian model describing statistical relationships between data associated with different KE, which can be used to predict the Margin of Exposure for a given scenario.

Challenge 3: acceptance and development of AOP-based statistical or machine learning based approaches for quantifying risk

qAOPs and NGRA decision frameworks

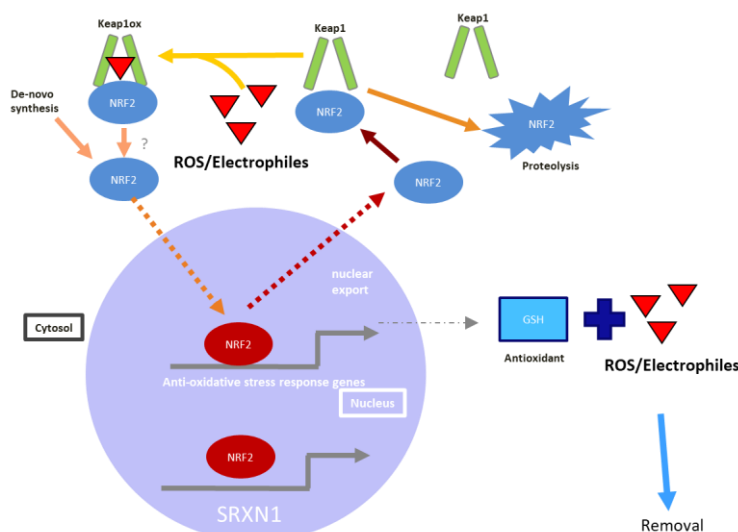


Case study 2. Using qAOPs at tier 2 for distinguishing between adaptive and adverse responses

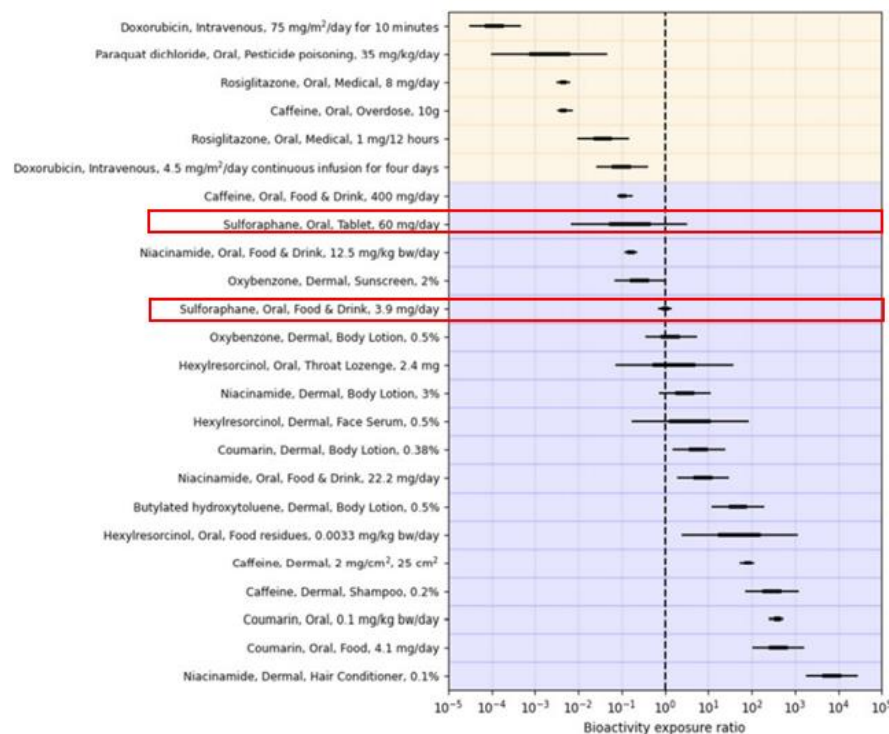
Sulforaphane case study

- Sulforaphane is a plant compound found in cruciferous vegetables like broccoli, cabbage, cauliflower, and kale.
- Under normal consumption, the BER<1 indicating exposure is likely to trigger bioactivity.
- Sulforaphane is an activator of Nrf2.
- Is the sulforaphane triggering an adverse effect?

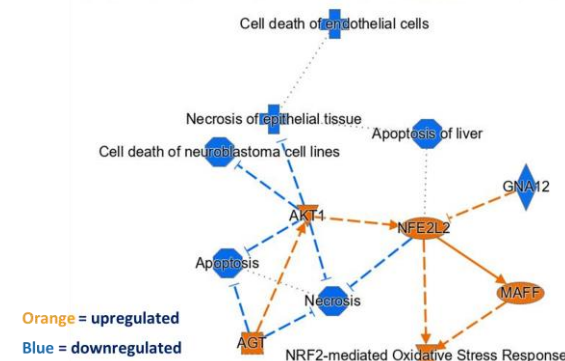
Sulforaphane



Key event in multiple AOPs linked to organ toxicity



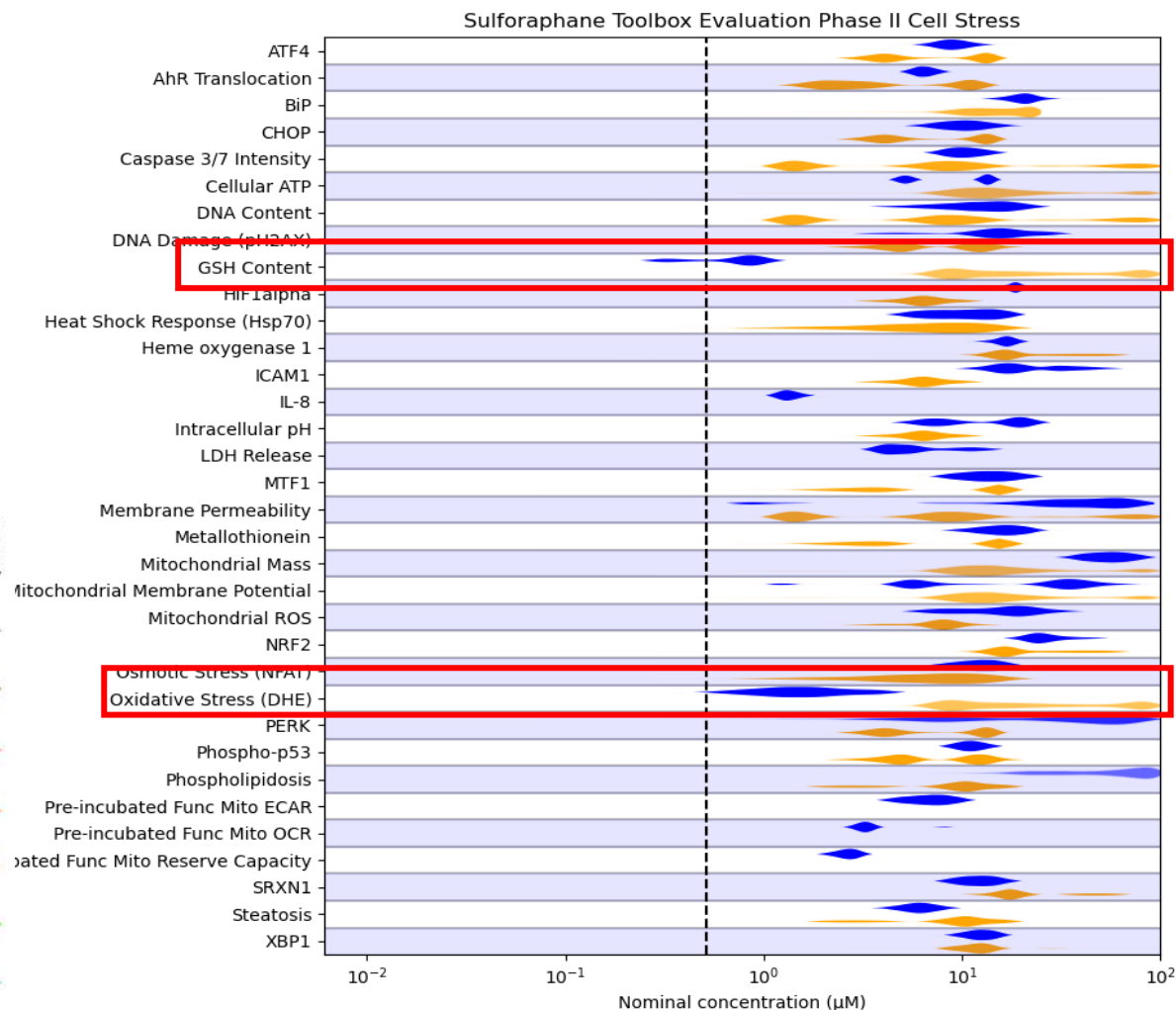
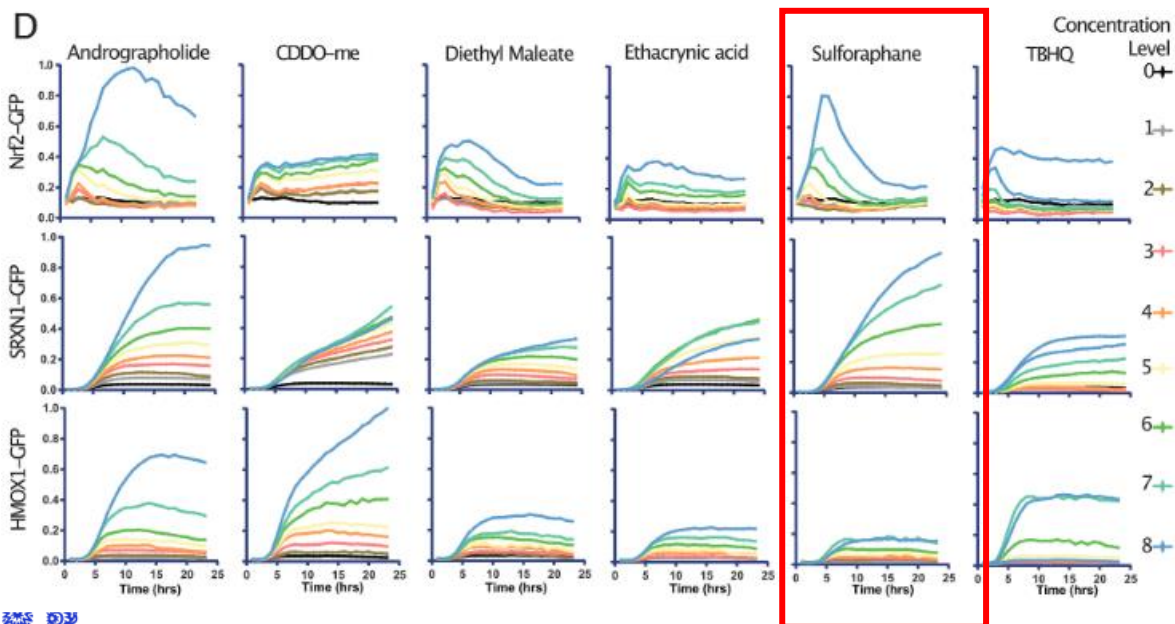
HepG2_Sulforaphane_Waldstastic_CONCENTRATION_0.8_vs_0.11_08_22 Summary Graph



Orange = upregulated
Blue = downregulated

CSP Bioactivity Summary Plot

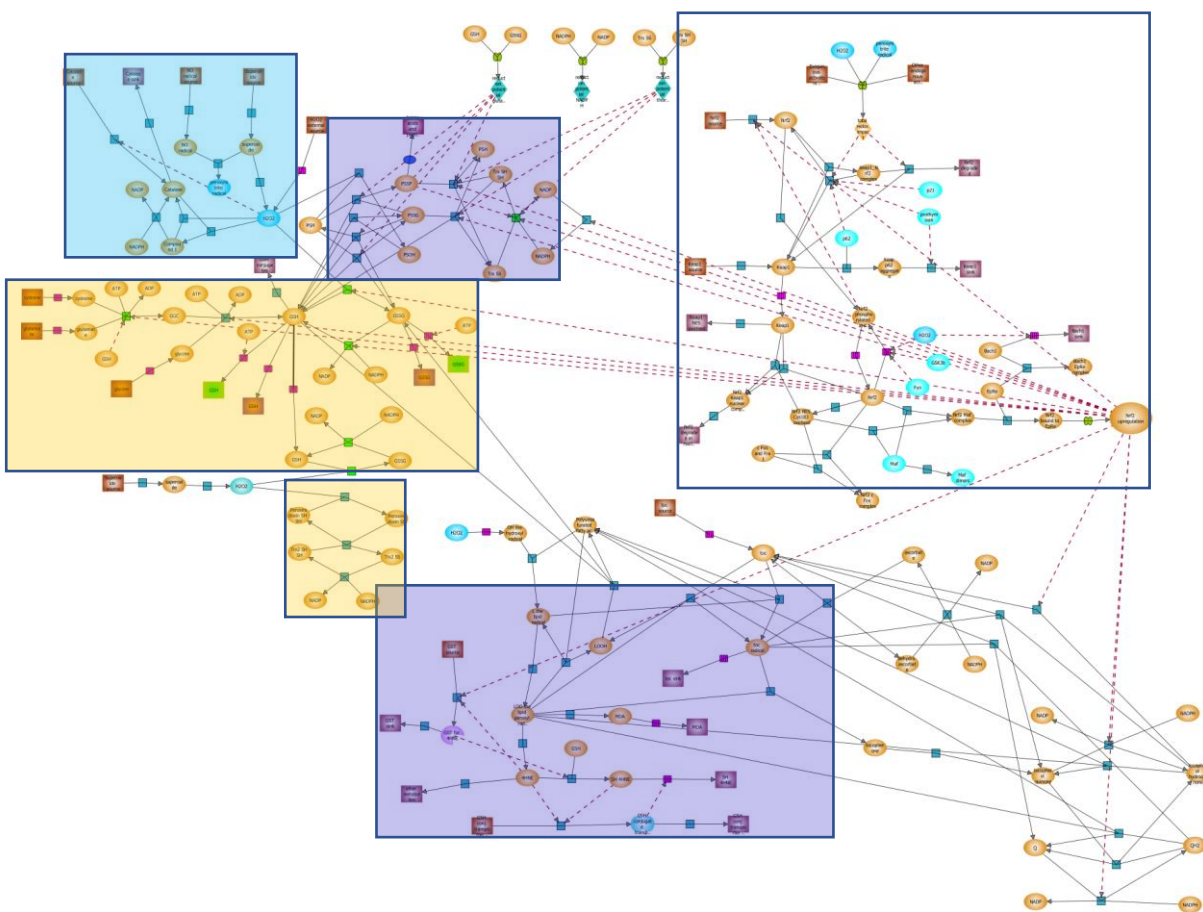
- **Blue** = PoDs for assay-specific biomarkers.
- **Orange** = pooled PoDs for assay-specific cell health.
- **GSH content = lowest Platform PoD (0.51 μM)**
- **Lowest PoDs related to Oxidative Stress & Inflammation**



Taken from Braak et al, Toxicology in vitro 84 (2022)
<https://doi.org/10.1016/j.tiv.2022.105419>

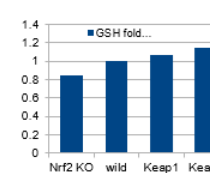
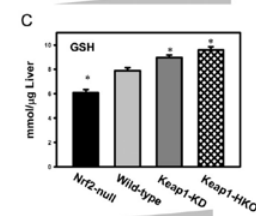
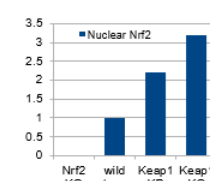
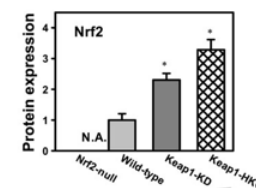
Early Oxidative stress systems model

Challenge 4: Developing qAOP systems toxicology approaches that are truly chemical agnostic for use NGRA decision frameworks.

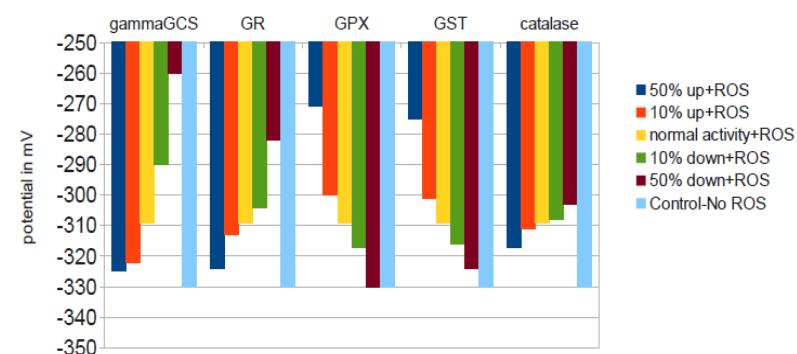


Results from literature [Wu]

Simulation results



Comparative analysis of model simulation results to literature and experimental findings.



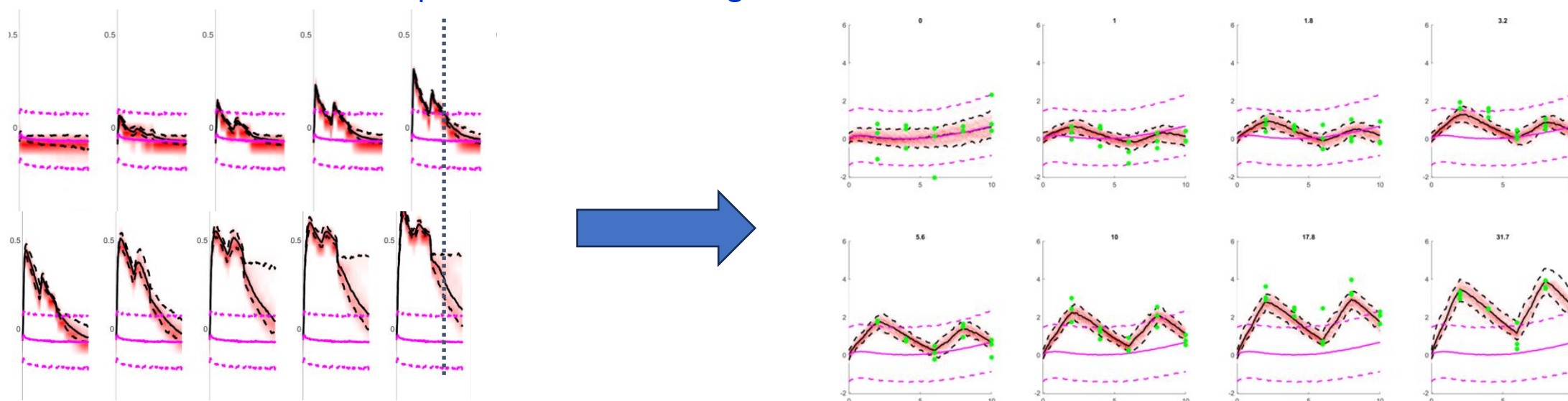
Determination of Redox Sensitive components of the model – Glutathione redox potential

Using qAOPs at tier 2 for distinguishing between adaptive and adverse responses

- Various groups have built ODE-based mechanistic systems biology models of the Nrf2 regulatory network such as in kidney, liver
- On the other hand, chemically agnostic machine learning based approaches may be useful, but these will not necessarily be mechanistic.
- Leads to additional challenges around acceptance
- Focus on understanding homeostatic control of system to return to baseline - understand interplay between exposure and response
- Use repeat dose data generated in Leiden University

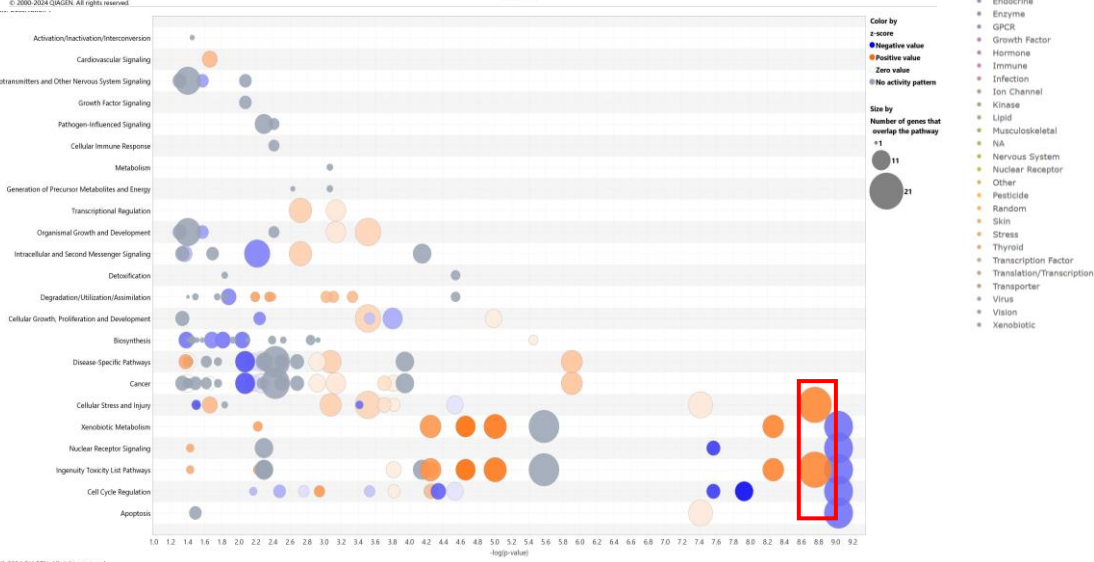
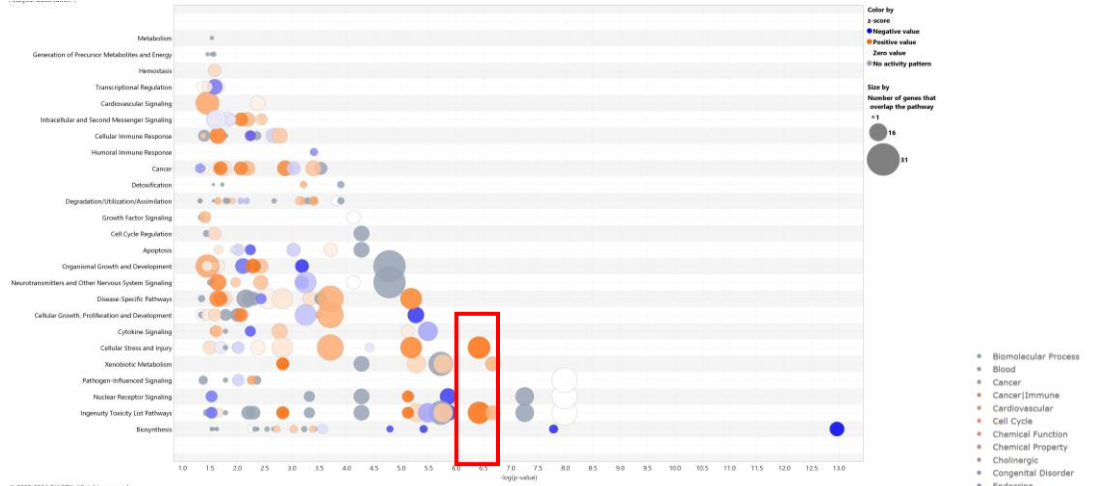
| Chemical | Use scenario | Route | PBK L1 C _{max} (μM) | PBK L2 C _{max} (μM) | PBK L3 C _{max} (μM) | Measured C _{max} (μM) |
|--------------|--------------------------|-------|------------------------------|------------------------------|------------------------------|--------------------------------|
| Sulforaphane | Food & Drink, 3.9 mg/day | Oral | 0.23 | 0.15 | N/A | 0.070 |
| Sulforaphane | Tablet, 60 mg/day | Oral | 1.2 | 0.77 | N/A | N/A |

Nrf2 response under increasing concentrations of SFN

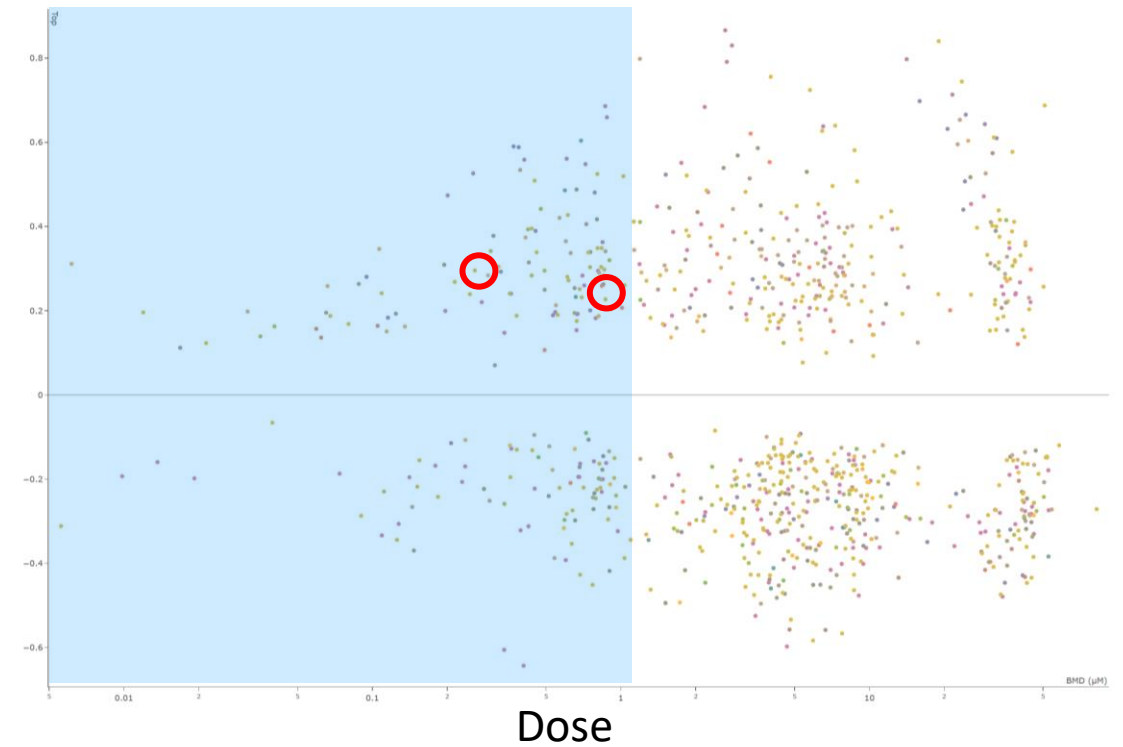


Data generated Leiden University

Challenge –secondary non-specific effects occurring within same dose range



Data from Toxcast Dashboard for Sulforaphane showing HTTr gene sets plotted against dose

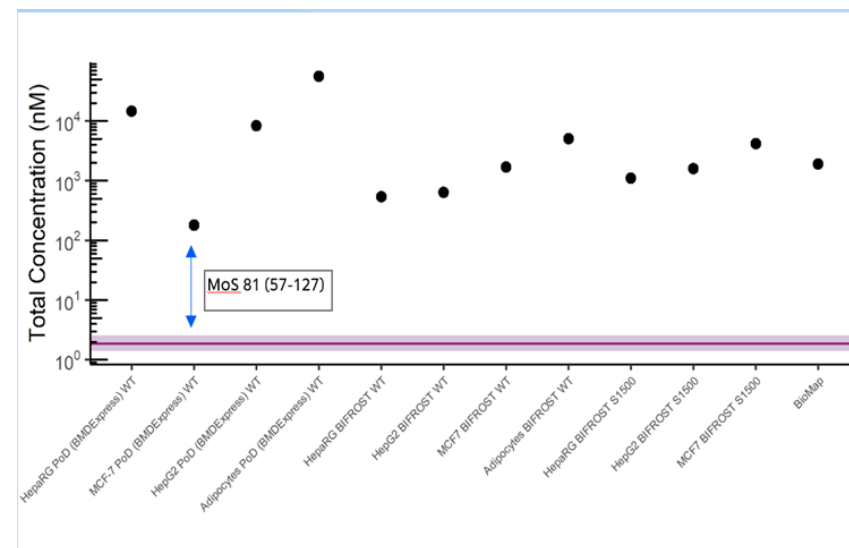
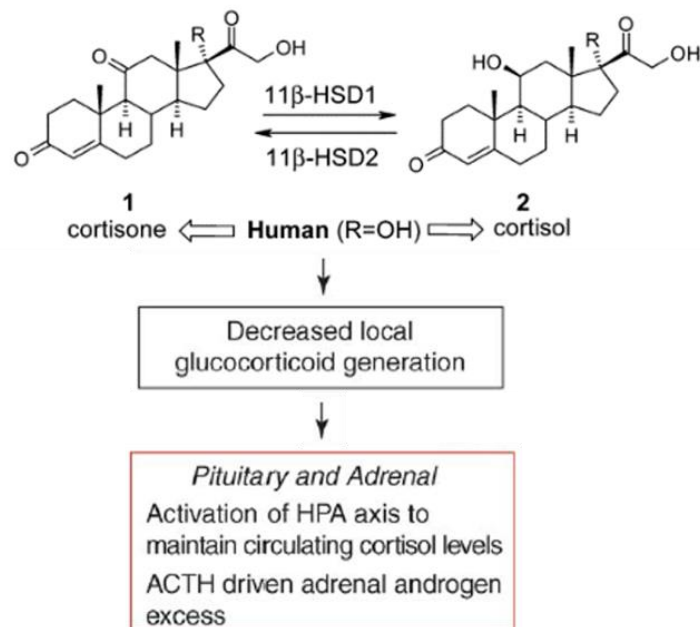


| Chemical | Use scenario | Route | PBK L1 Cmax (μM) | PBK L2 Cmax (μM) | PBK L3 Cmax (μM) | Measured Cmax (μM) |
|--------------|--------------------------|-------|------------------|------------------|------------------|--------------------|
| Sulforaphane | Food & Drink, 3.9 mg/day | Oral | 0.23 | 0.15 | N/A | 0.070 |
| Sulforaphane | Tablet, 60 mg/day | Oral | 1.2 | 0.77 | N/A | N/A |

IPA Plots from internal HTTr analysis of sulforaphane
 In 2 cell lines – Nrf2 response gene sets highlighted in red

Case study 3: Support consideration when specific mode of action identified

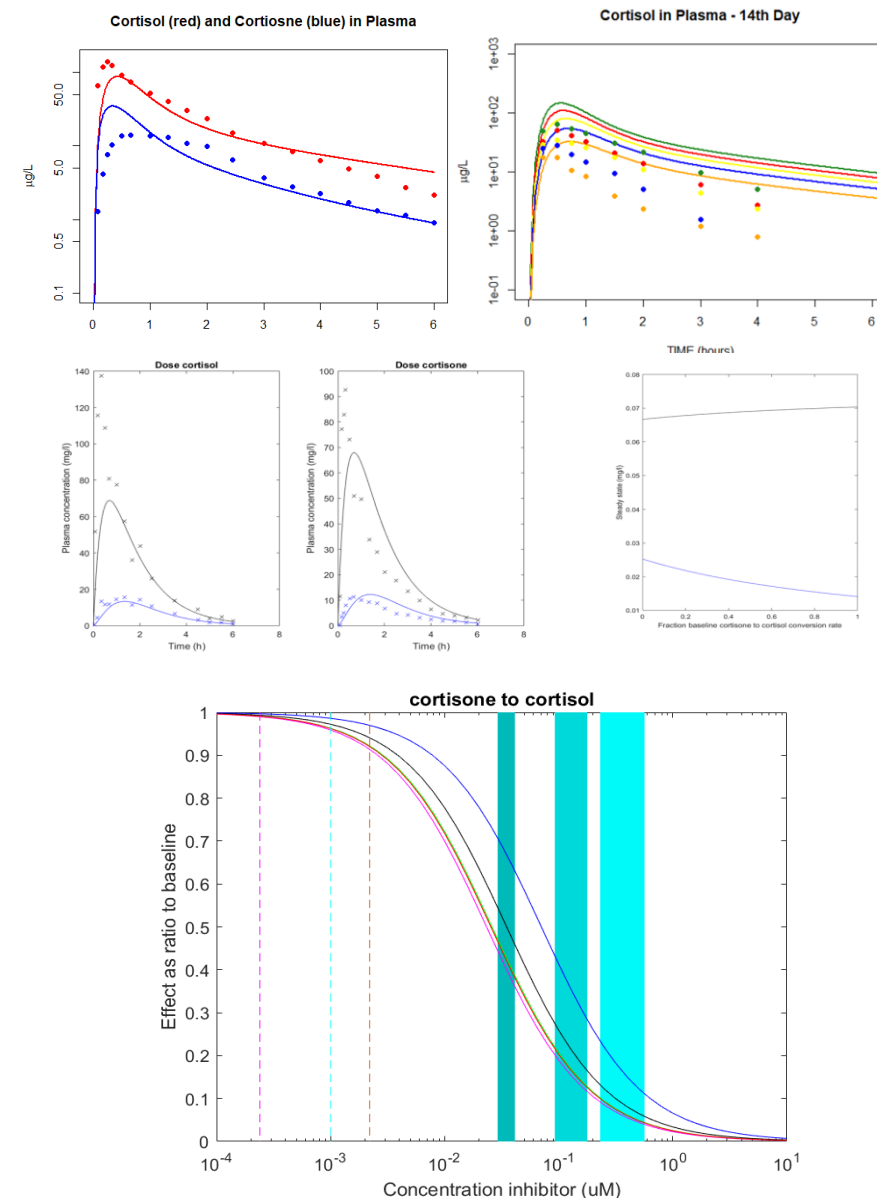
- Example when specific modality has been identified with other non-specific effects
- Focus on Systemic toxicity consideration
- Identified impact resulting in inhibition of 11B-HSD1 – no AOP identified
- Advantage human clinical relevant data identified



Bioactivity: exposure (BER) plot for consumer use scenario. Magenta line indicates the predicted systemic exposure (2.2nM). pale pink region indicates the uncertainty. No specific hits from MIE panel including CERUP targets

Case study 3 cont.

- Build a mechanistic model of systemic concentrations of cortisol, cortisone and an inhibitor of 11bHSD1 – utilised to predict the corresponding impact on levels of cortisol from H11bHSD1 inhibitors
- Initially replicating published clinical data parametrised in vitro findings and subsequently to support predictions of compound of interest.
- model produces predictions of cortisol and cortisone plasma concentrations that agree reasonably well with clinical measurements of baseline but underestimates reduction in cortisol
- A second simplified model build subsequently improved in replicating cortisone plasma kinetics and understand impact of steady state levels by following inclusion of a cortisol production rate.
- Final image brings together in vitro inhibition to clinical data and predicted systemic exposure
- Low amounts of inhibition produced only minor changes in systemic concentrations of cortisol and cortisone



Discussion

- NGRA is a tiered approach for making decisions without the use of animal data
- In many cases, protective safety decisions can be made without the use of AOPs e.g.
 - For chemicals where no lead MoA can be identified or where multiple targets of activity are observed in a narrow dose range this is a more pragmatic solution
- For the foreseeable future we can foresee use of AOPs to address specific concerns rather than a globally applicable solution for more complex endpoints, e.g.
 - AOPs can be useful in designing either a tier 1 or 2 testing strategy when enough is known about an endpoint of concern (e.g. skin sensitisation).
 - qAOPs may also be helpful at tier 2 in distinguishing between adaptive and adverse effects
- qAOPs do not necessarily have to be fully mechanistic (i.e., systems biology) models, and other approaches should be considered (e.g., statistical or machine-learning based).
- The determination of what is required for acceptance for these models especially those predictive models less reliant on mechanistic basis has yet to be defined.

Acknowledgements

- Alistair Middleton, Maria Baltazar, Sophie Cable, Paul Carmichael, Tom Cull, Matthew Dent, Nicky Gilmour, Sarah Hatherall, Predrag Kukic, Cameron MacKay, Gavin Maxwell, Sophie Malcomber, Claire Peart, Georgia Reynolds, Joe Reynolds, Adam Wood
- Prof. Bob Van De Water, Marije Niemeijer, Joost Beltman, Leiden University
- Ramboll Consultancy

Thank You



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