

Applicability of systems biology in toxicology

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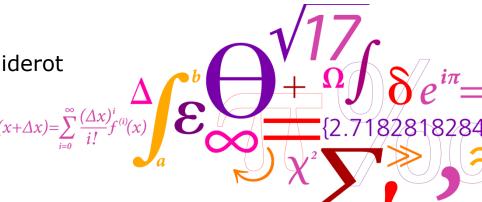
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DTU Food

National Food Institute





Outline

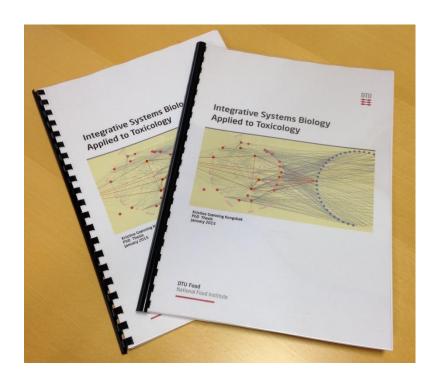
- Background/scope
 - What is systems biology?
- Computational toxicology projects
 - Integrative systems biology
 - Predictive modeling





Scope

• Assess whether (integrative) systems biology methods can supplement traditional *in vivo* and *in vitro* toxicological investigations.







What is systems biology?

Whole (organism)



Holism (Systems biology)

Reductionism (Molecular biology)



(molecules)





PROJECTS

Integrative systems biology Modeling ToxCast™ Data





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MiniReview

Applicability of Computational Systems Biology in Toxicology

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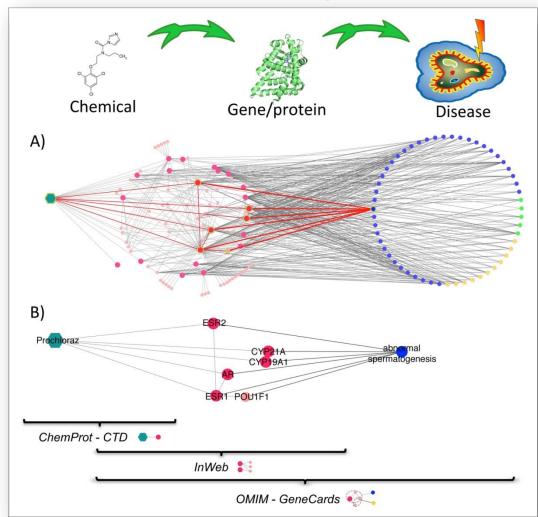
A Computational Approach to Mechanistic and Predictive Toxicology of Pesticides

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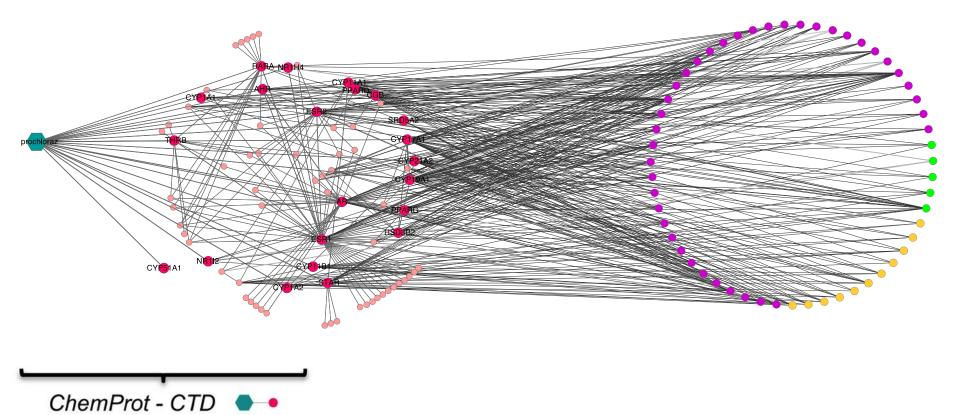


Integrative systems biology

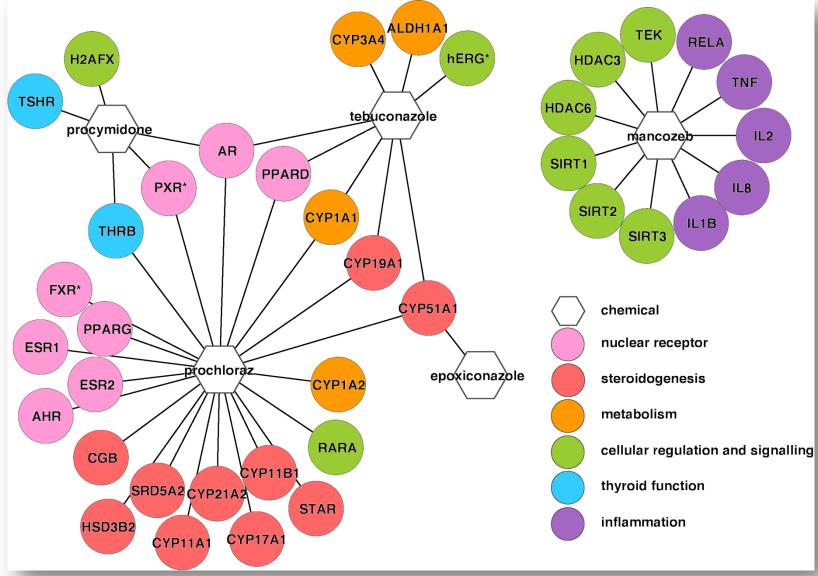


[Kongsbak et al. 2014]

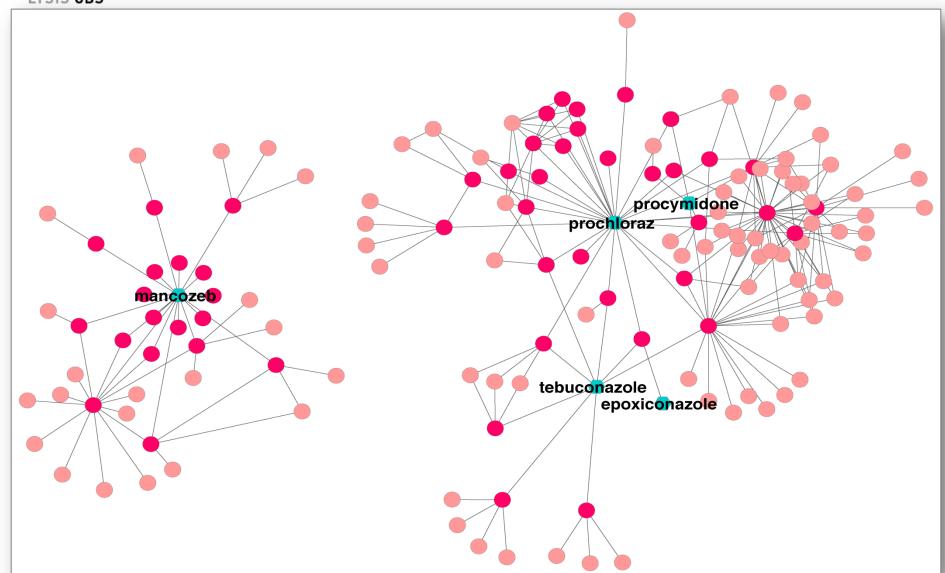






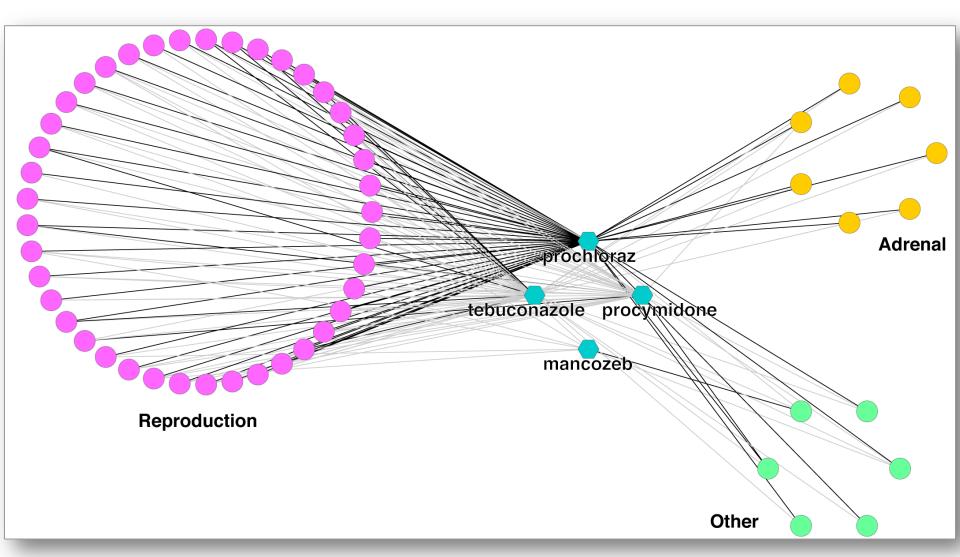




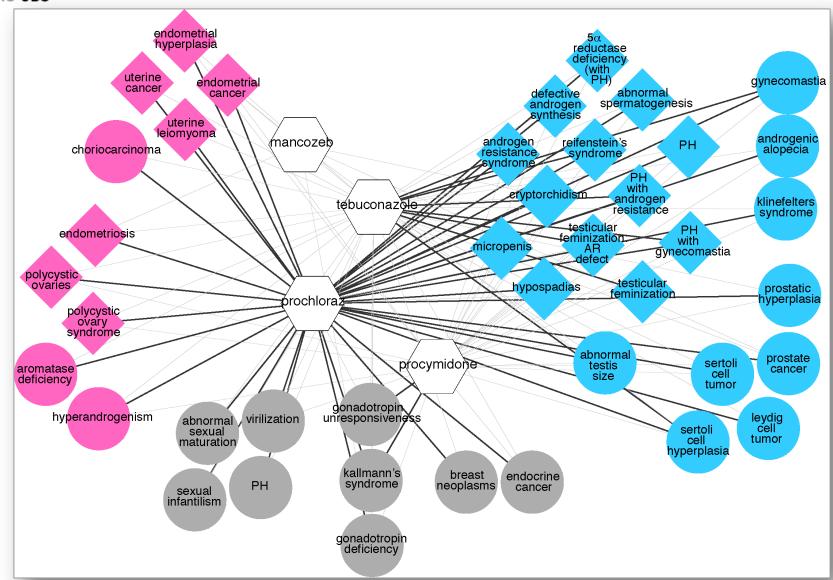












Strengths and Limitations



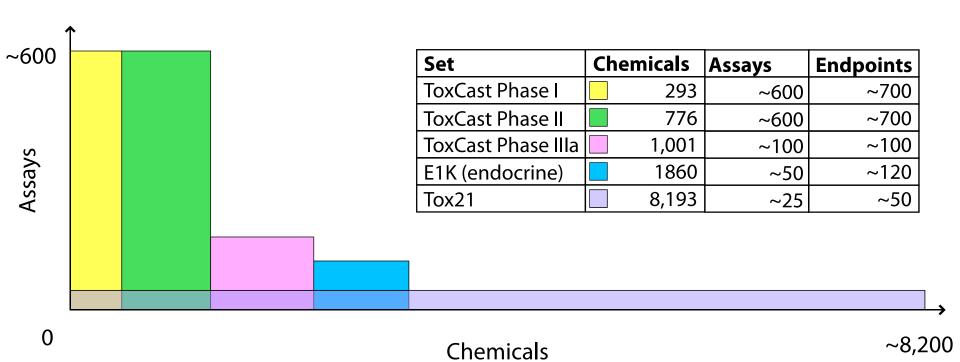
- Quick and "dirty"
- Overview of available data
- Predictions of potential pathway or disease associations
- Human predictions
- Grouping of chemicals for mixture predictions

- •Dependence on the amount and quality of experimental evidence
- Backtracking data source
- The type of association



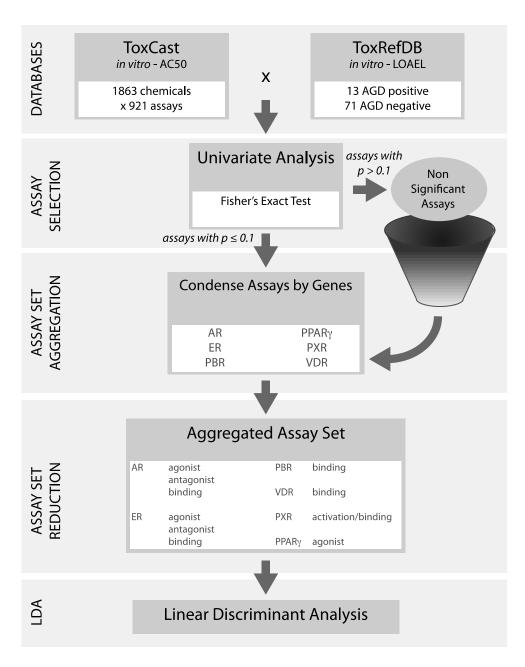


Modeling ToxCast™



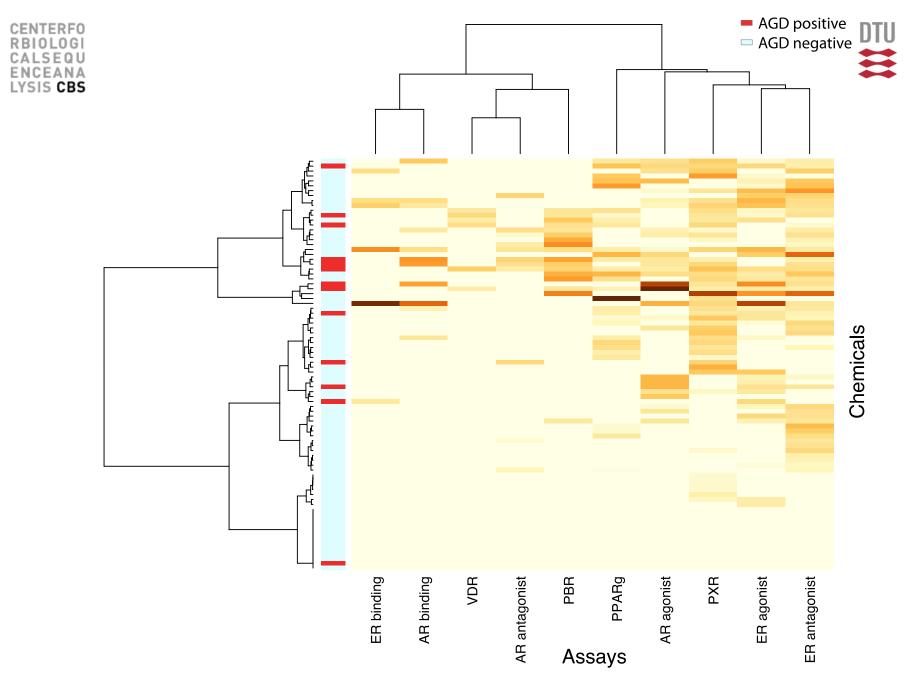


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Adapted from [Martin et al. 2011, Sipes et al. 2011]







External validation

Chemical name	LOAEL	Evidence of reproductive toxicity	Predicted reproductive toxicant
Epoxiconazole	15 mg/kg/day	Yes	No
Ketoconazole	50 mg/kg/day	Yes	Yes
Genistein	5 ppm	Yes	No
Linuron	75 mg/kg/day	Yes	Yes
Prochloraz	50 mg/kg/day	Yes	No
Paracetamol	150 mg/kg/day	Yes	No
Propiconazole	2500 ppm	No	Yes
Tebuconazole	NA	No	Yes
Di-n-octyl phthalate	NA	No	No
Ethylparaben	NA	No	No
Heptachlor	NA	No	No
Lindane	NA	No	Yes
${\bf Octamethyl cyclotetrasil oxane}$	NA	No	No
Dimethyl phthalate	NA	No	No





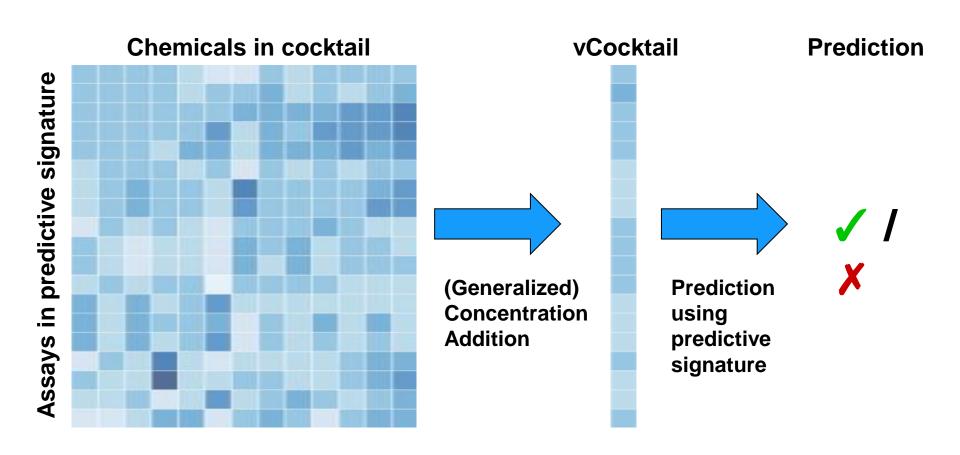
External validation

	Model statistics		
	Full model	Validation	
Sensitivity	62 %	33 %	
Specificity	94~%	63~%	
Balanced accuracy	78~%	48~%	
Accuracy	89~%	50~%	
Precision	67~%	40~%	
p-value	1×10^{-6}	NS	

NS: Not significant



Virtual cocktail





Computational toxicology – Major findings



- Different methods contributes differently
- Integrative systems biology allows grouping according to effects in humans
- Modeling ToxCast can help prioritize chemicals for further testing
- Input to mode of action
- Input to hypothesis generation





Thanks ©

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