

Guest editorial:

CONCEPTS OF PREDICTIVE TOXICOLOGY

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Currently, much effort is invested into the development of non-animal testing strategies to identify the potential of compounds to induce systemic toxicity (Hammad, 2013; Stewart and Marchan, 2012). Organotypical *in vitro* systems are particularly popular in the fields of kidney (Limonciel et al., 2012; Jennings et al., 2012; Valente et al., 2012), heart (Maayah et al., 2014; Bonifacio et al., 2014), liver (Grinberg et al., 2014; Godoy et al., 2013; Schug et al., 2013) and developmental toxicity (Weng et al., 2014; Waldmann et al., 2014; Krug et al., 2013). However, it is also clear that *in vitro* systems represent valuable tools to study certain mechanisms and endpoints but do not reach the complexity of organs or organisms (Ghallab, 2013).

Recently, Daston et al. (2014) published a concept, how future research on non-animal methodology should be designed to overcome current limitations. The authors recommend two complementary and inter-connecting concepts. A first work stream should focus on toxicity characterization. Here, critical biological targets and mechanisms leading to toxic effects should be elucidated based on *in vitro* systems. For this purpose methods such as high-throughput and high content screening and computational modelling will be applied (Daston et al., 2014). A second work stream should focus on translation into regulation. Specific aims are for example methods for grouping, read-across strategies and *in vitro* methods to derive no-effect levels. In recent years much has been written about grouping strategies

and general concepts to improve chemical risk evaluation (Geenen et al., 2012; Kalkhof et al., 2012; Keller et al., 2009; Renwick, 2004; Zbinden, 1993; Gebel et al., 2014; Calabrese, 2013). The present concept paper of Daston and colleagues (2014) belongs certainly to the most fundamental papers in this field and is a must-read for anyone interested in predictive toxicology and alternative methods. However, the authors neglect one major limitation of their strategy: The concept may lead to reasonable predictions for chemicals with unspecific mechanisms of action, meaning that many mechanisms are simultaneously active that lead to the breakdown of cellular functions. However, the concept may fail for highly specific mechanisms of action. The reason for this limitation is that Daston et al. (2014) in agreement with the SEURAT concept recommend focusing on ‘critical biological targets’ in *in vitro* systems only (Jennings et al., 2014). This bears the risk of establishing an illusory *in vitro* world which lacks critical components of real organs or organisms. Let us assume a compound specifically inhibits reabsorption of bile salts in cholangiocytes in bile ducts. How should this mechanism be recognized in an *in vitro* system that contains hepatocytes only? Moreover, it cannot be excluded that a compound may alter kidney cells in a way that triggers the attack of immune cells. Can we be sure that this specific mechanism would be identified in an *in vitro* system containing renal proximal tubular epithelial cells only? A research program to *in vitro* systems only has a high probability to

fail. Therefore, a third work stream is painfully missing in the concept of Daston et al. (2014); namely research that systematically compares mechanisms of toxicity *in vitro* and *in vivo*. Do the currently available *in vitro* systems really recapitulate the mechanisms that finally lead to adverse effects *in vivo*? Finally, it should not be ignored that many mechanisms leading to toxicity *in vivo* are far from being fully understood. Further research is needed to identify key mechanisms of toxicity *in vivo* to be able to establish *in vitro* systems recapitulating these mechanisms. Although it may seem paradox: the successful development of non-animal methodology requires animal experiments.

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