How to overcome limitations of new approach methodologies in the context of regulatory science

Romualdo Benigni

Istituto Superiore di Sanita'

romualdo.benigni@gmail.com

Chemical Risk Assessment into this century

•Animal toxicology has been the major source of information, but now opportunities to accept "alternative" approaches (*in vitro*, QSAR)

•New focus on the elucidation of the **details of mechanisms of toxicological action** to build **predictive models** (e.g., AOPs, Tox21)

Do Alternative Methods predict Apical Toxicity Endpoints ?

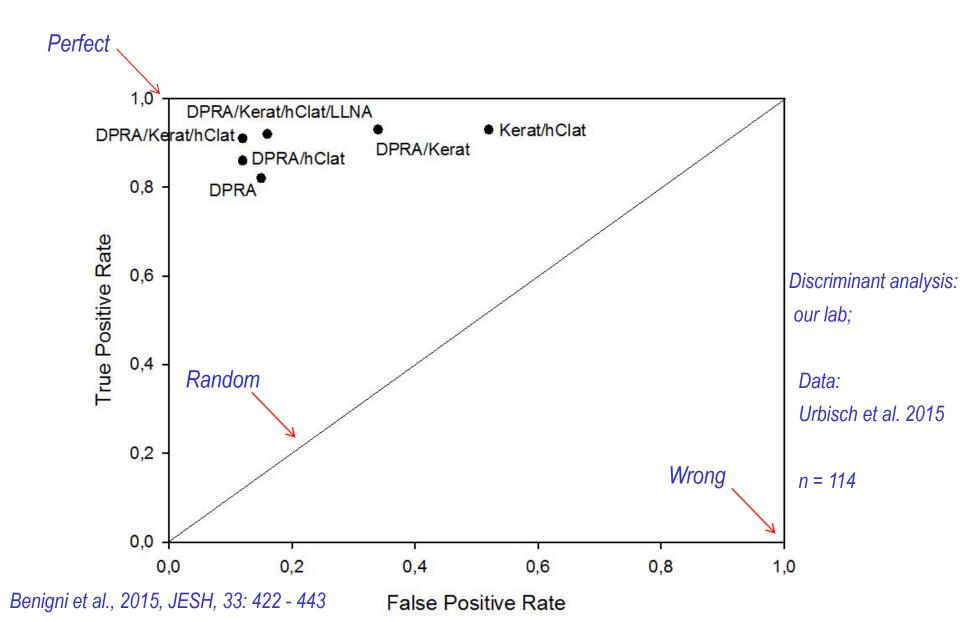
• Regulatory issue:

present regulations are based on apical endpoints

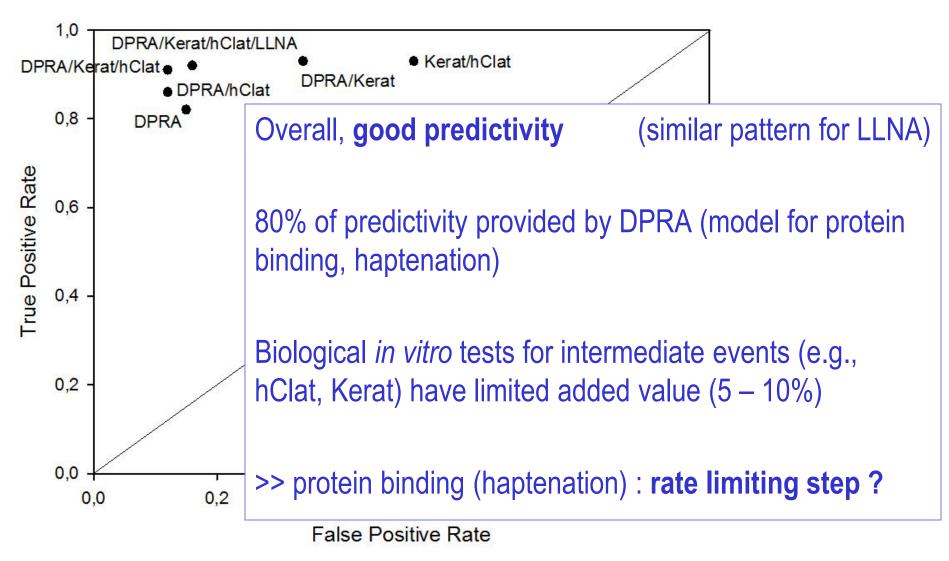
• Scientific issue:

correct predictions are the necessary **reality check f**or theories and hypotheses

Study I: Skin Sensitization, predicting Human data



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Benigni et al., 2015, JESH, 33: 422 - 443

Study II. Predicting rodent and human carcinogens: an integrated testing strategy (tier)

Tier 1: DNA-reactivity (Salmonella and / or Structural Alerts)

If a chemical is negative

Tier 2: Tissue microarchitecture disorganization (SHE Cell Transformation)

If a chemical is negative in both tiers

Low probability of being a carcinogen

Benigni et al., 2013, Mutagenesis., 28: 107 – 116; Benigni et al., 2013, Mutat.Res., 758: 56 – 61

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Predictivity:

rodent carcinogens:90 – 95%(125 / 130)IARC human carcinogens (1,2a,2b):99%(326 / 329)

both genotoxic and nongenotoxic carcinogens

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A complex endpoint modelled through a few rate limiting steps?

Study III. Toxcast assays versus Apical toxicity endpoints

in vivo endpoints (31 parameters / measures from Toolbox dbs)
 Carcinogenicity, Ames, *in vivo* Micronucleus, Acute, Subchronic, Repeated Dose, Reproduction and Development, Skin Sensitization, Endocrine disruptors

Toxcast assays

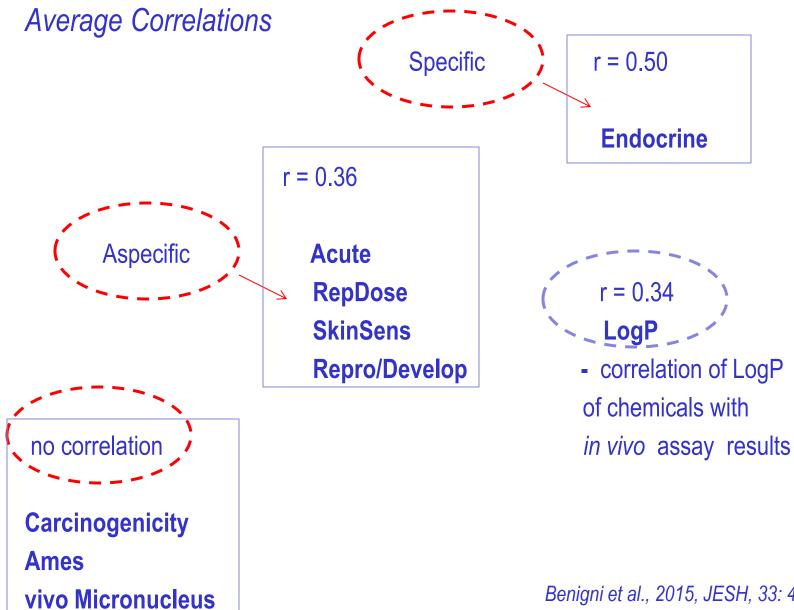
n = 248, selected out of 913 assays (matching chemicals, etc...)

each *in vivo* test / parameter (n=31) *versus* each Toxcast assay (n=248): >>> 248 x 31 **≈ 1000 Spearman rank correlation coefficients**

Out of a floor of weak correlations, ≈ 80 correlation coeffs. statistically significant

Benigni et al., 2015, JESH, 33: 422 - 443

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Study III. Toxcast assays versus Apical toxicity endpoints

Improvement of Toxcast assays in progress (e.g., metabolism), only **overall pattern of results important:**

- **Difficulties in modeling intermediate key events** (confirms Skin Sensitization results)
- *in vivo:* continuum of events, with feedbacks *in vitro* tests for intermediate events -in isolation- not a realistic model
- Systemic toxicity endpoints (e.g., RepDose, Repro): not well defined mechanistically

Study IV. QSARs of Apical Toxicity Endpoints

• Skin Carcinogenicity by Polycyclic Aromatic Hydrocarbons

 $log \ Iball = 0.55 \ log \ P - 1.17 \ log(\beta \ 10log P + 1) + 0.39 \ LK + 0.47 \ HOMO + 1.93$ $log \ P0 = 6.67(\pm 0.217), \quad log \ \beta = -6.81, \ n = 161, \ r = 0.845, \ s = 0.350, \ F1,155 \ = 12.8$ $Zhang, \ et \ al., \ 1992, \ Chem. \ Biol. \ Interact. \ 81: \ 149.$

• Carcinogenicity (-/+) by Aromatic Amines

Canc = - 1.16 HOMO + 1.76 LUMO – 2.86 L(R) + 2.65 B5(R) + 0.40 MR3 + 0.58 MR5 + 0.54 MR6 – 1.55 I(An) + 0.74 I(NO2) – 0.55 I(BiBr)

n = 66 (- =44; + = 73) Correct Classification = 87.9 %

Franke et al., 2001, Carcinogenesis, 22: 1561-1571

Study IV. QSARs of Apical Toxicity Endpoints

What do these QSARs mean ?

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 >>> easily metabolized

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Metabolic activation the rate limiting step?

QSARs: Predictive models based on a few parameters.

Hansch, Chem. Rev. 2002, 102: 783-812

The way to create a new and faster toxicology is still long, but progress is apparent. I.

• Some complex endpoints (e.g., skin sens, carcinogenicity) can be predicted with **satisfactory accuracy** by alternative methods

 Compare with inherent variability, and predictivity of animal tests towards human data

> (e.g., LLNA versus Human: Accuracy = 0.82 n = 111) LLNA versus Human Potencies: r = 0.76 n = 90)

The way to create a new and faster toxicology is still long, but progress is apparent. II.

Lessons learned

• Successful predictive models usually based on the quantification of only one, or a few rate-limiting steps.

- Rate-limiting steps: often **initiating events** of toxicological pathways.
- Markers for intermediate events have a more limited correlation with most endpoints.

The way to create a new and faster toxicology is still long, but progress is apparent. Ill.

- quantification of only **one, or a few rate-limiting steps...**
- This contrasts with the current trend to dissect more and more the toxicity pathways

• ... but confirms the general experience of building predictive models

"...In fields like ecology, systems biology, and macroeconomics, **grossly** simplified models capture important features of the behavior of incredibly complex interacting systems..." Transtrum et al., 2015, J.Chem.Phys., 143: 010901.

Empirical analysis of data is the only guide in the evolution of our understanding of how chemicals affect living systems Corwin Hansch

 Types of toxicological pathways very different in nature: a simplified linear chain inadequate (feedbacks, intersections)

Biological plausibility not sufficient

e.g., the dramatic story of the beta-caroten trial:

Beta-carotene: a cancer chemopreventive agent or a co-carcinogen? Paolini et al. Mutat. Res. 2003, 543:195-200.

Fill the operational gap between theory and implements:
 Quantitative data analysis in the hands of experts in toxicology

Acknowledgements

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