

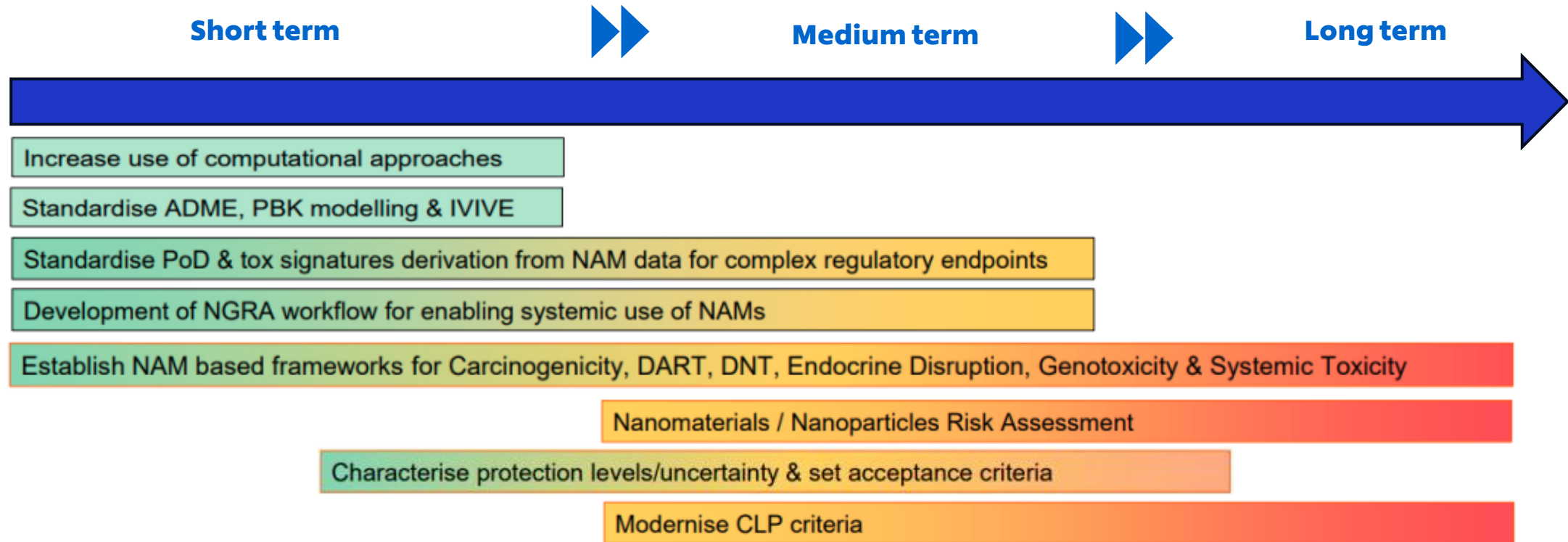
AI-augmented NGRA: Opportunities to Accelerate Phase out of Animal Testing for Chemical Safety Assessment

SERS
Safety, Environmental
& Regulatory Science



Predrag Kukic
June 2nd 2026

EU Roadmap to Phase out Animal Testing: Cross Sector Animal Free NGRA



EU Roadmap to Phase out Animal Testing: Cross Sector Animal Free NGRA

Short term

Medium term

Long term



Increase use of computational approaches

Standardise ADME, PBK modelling & IVIVE

Standardise PoD & tox signatures derivation from NAM data for complex regulatory endpoints

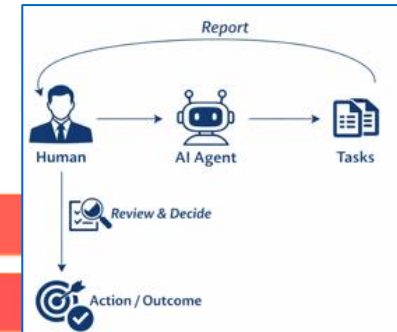
Development of NGRA workflow for enabling systemic use of NAMs

Establish NAM based frameworks for Carcinogenicity, DART, DNT, Endocrine Disruption, Genotoxicity & Systemic Toxicity

Nanomaterials / Nanoparticles Risk Assessment

Characterise protection levels/uncertainty & set acceptance criteria

Modernise CLP criteria



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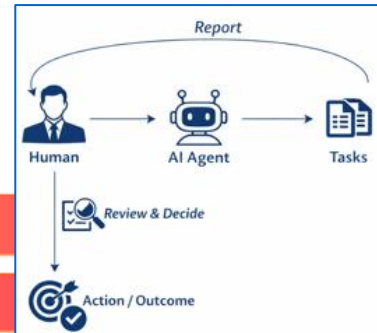
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TIER 0: IDENTIFY USE SCENARIO, CHEMICAL OF CONCERN AND COLLECT EXISTING INFORMATION

1. IDENTIFY EXPOSURE/USE SCENARIO

2. IDENTIFY MOLECULAR STRUCTURE

3. COLLECT SUPPORTING DATA

4. IDENTIFY ANALOGUES, SUITABILITY ASSESSMENT AND EXITING DATA

EXIT TTC

EXIT READ ACROSS

TIER 1: HYPOTHESIS FORMULATION FOR AB INITIO APPROACH

5. SYSTEMIC BIOAVAILABILITY (PARENT VS. METABOLITE(S), TARGET ORGANS, INTERNAL CONCENTRATION)

6. MOA HYPOTHESIS GENERATION (WEIGHT OF EVIDENCE BASED ON AVAILABLE TOOLS)

EXIT INTERNAL TTC

TIER 2: APPLICATION OF AB INITIO APPROACH

7A. TARGETED TESTING

7B. BIOKINETIC REFINEMENT (IN VIVO CLEARANCE, POPULATION, IN VITRO STABILITY, PARTITION)

8. POINTS OF DEPARTURE, IN VITRO IN VIVO EXTRAPOLATION, UNCERTAINTY ESTIMATION, MARGIN OF SAFETY

9. FINAL RISK ASSESSMENT OR SUMMARY ON INSUFFICIENT INFORMATION

EXIT AB INITIO

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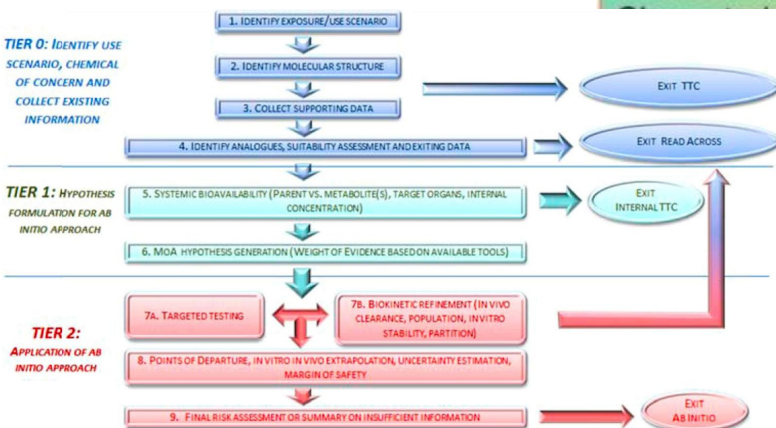
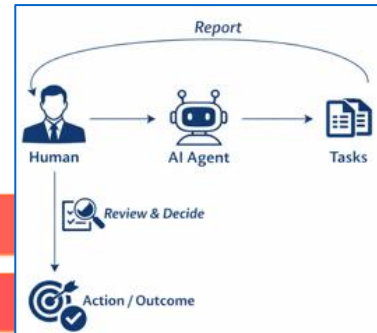
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AI Augmented NGRA: AI is transforming NGRA across 3 dimensions

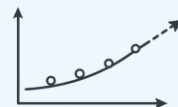
Knowledge/Data

- Extract insights from diverse data sources
- Enable mechanistic interpretation
- Support hypothesis generation



Prediction/Decision

- Generate predictions from data
- Model hazard and exposure
- Quantify risk and uncertainty



Standardisation/Automation

- Automate existing workflows
- Reduce routine manual effort



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Standardise PoD & tox signatures derivation from NAM data for complex regulatory endpoints

Characterise protection levels/uncertainty & set acceptance criteria

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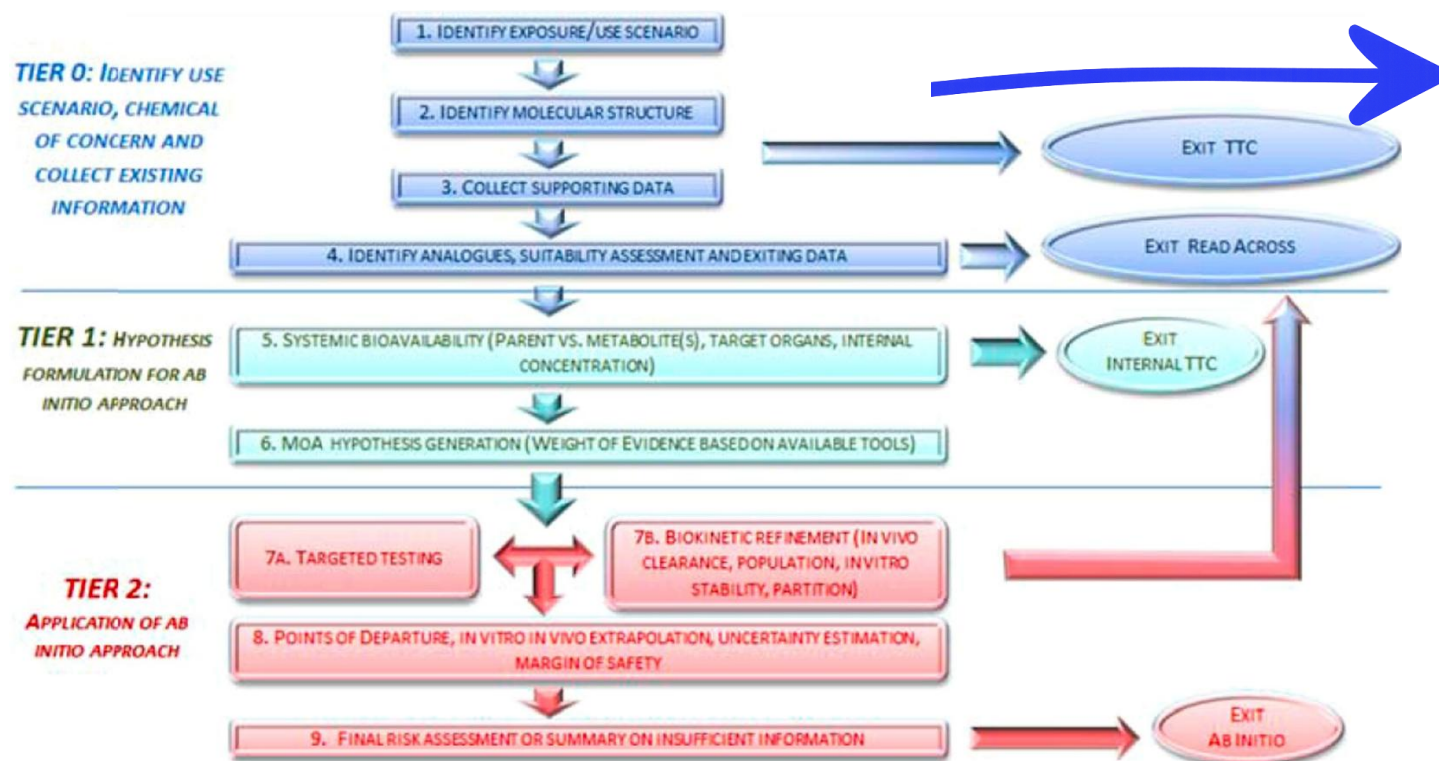
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Knowledge/Data: Extract Insights from Diverse Data Sources

Integration of structured and unstructured data



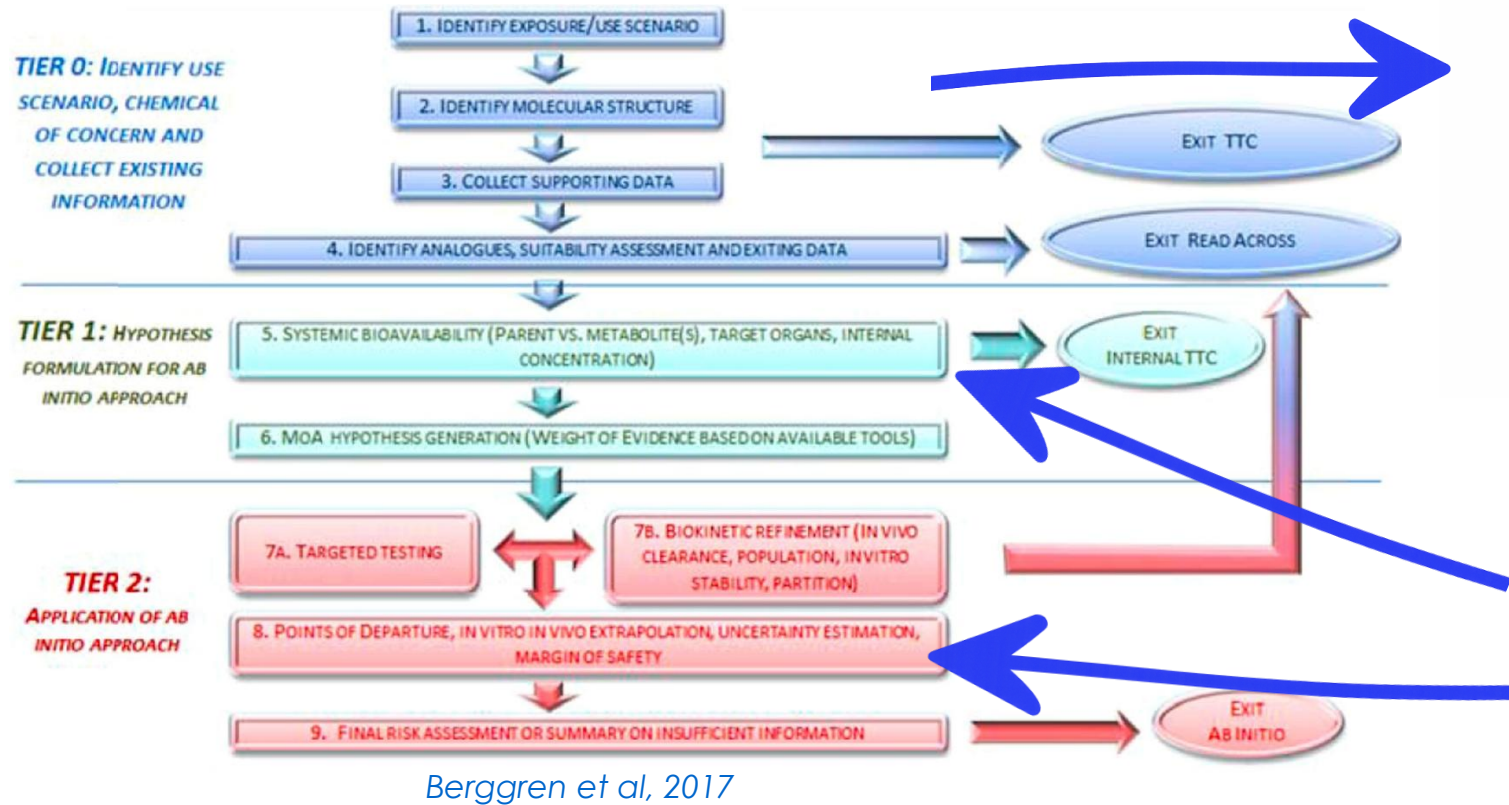
Berggren et al, 2017

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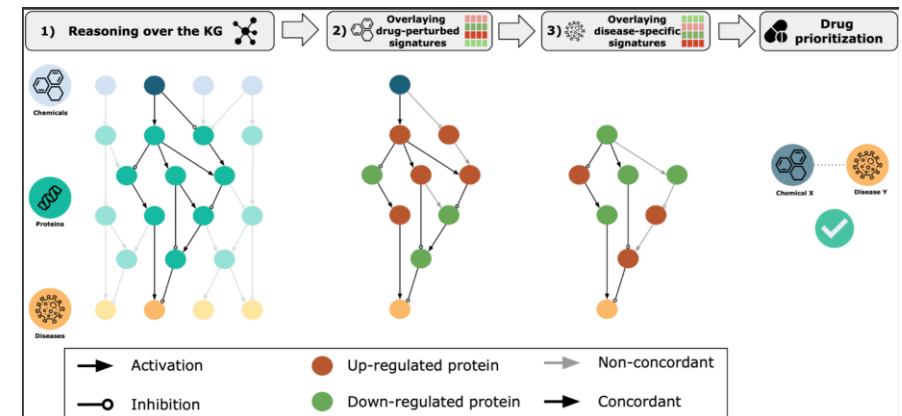
Knowledge/Data: Support Hypothesis Generation and Mechanistic Interpretation



Integration of structured and unstructured data



Example: Causal reasoning & hypothesis generation



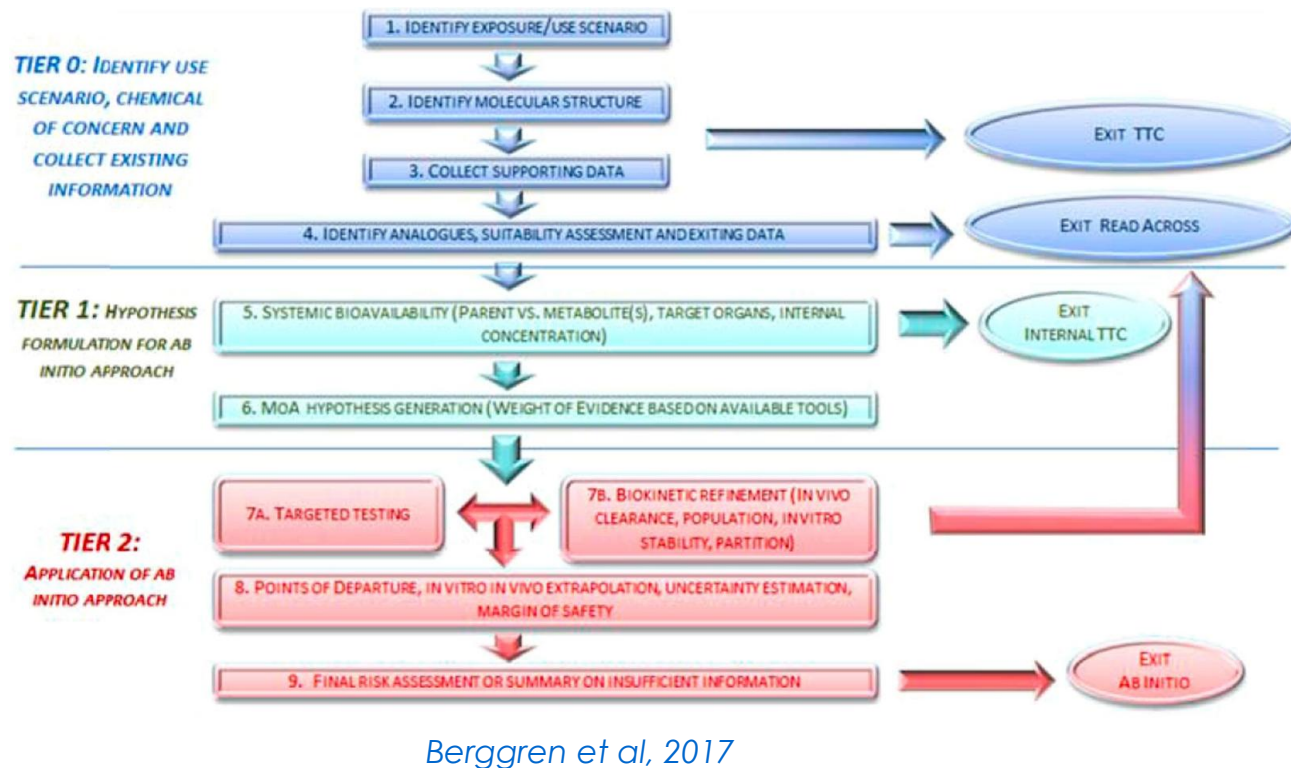
Domingo-Fernández et al, 2022

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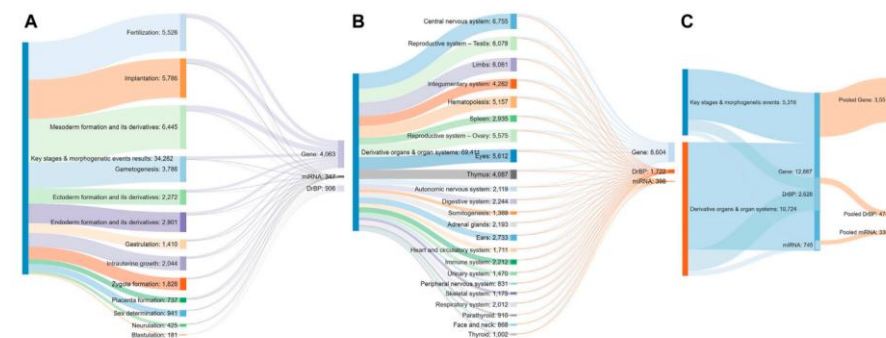
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Knowledge/Data: Biological Relevance of the NGRA workflow



Extraction of essential genes for Human Development and Reproduction



Rajagopal et al., (2022)

Defining Biological Space coverage in Systemic Toxicity Molecular and cellular targets

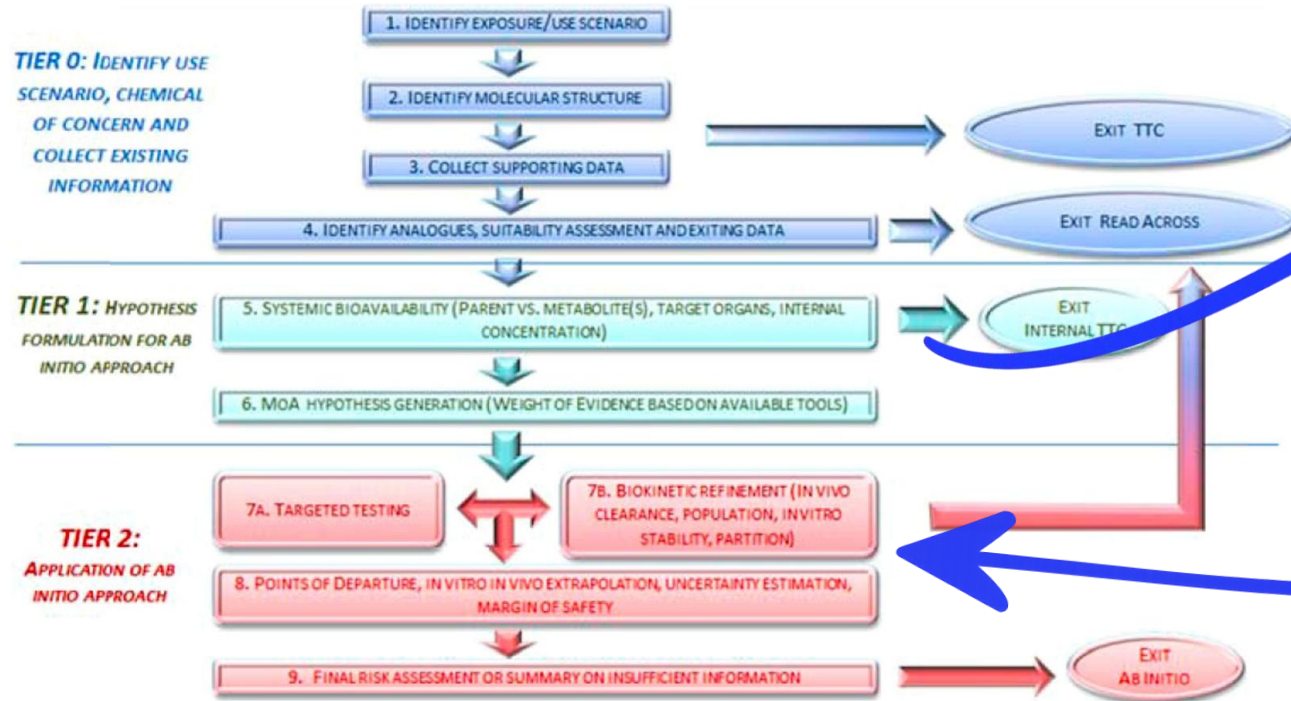


Shobair et al, in progress (ICCS)

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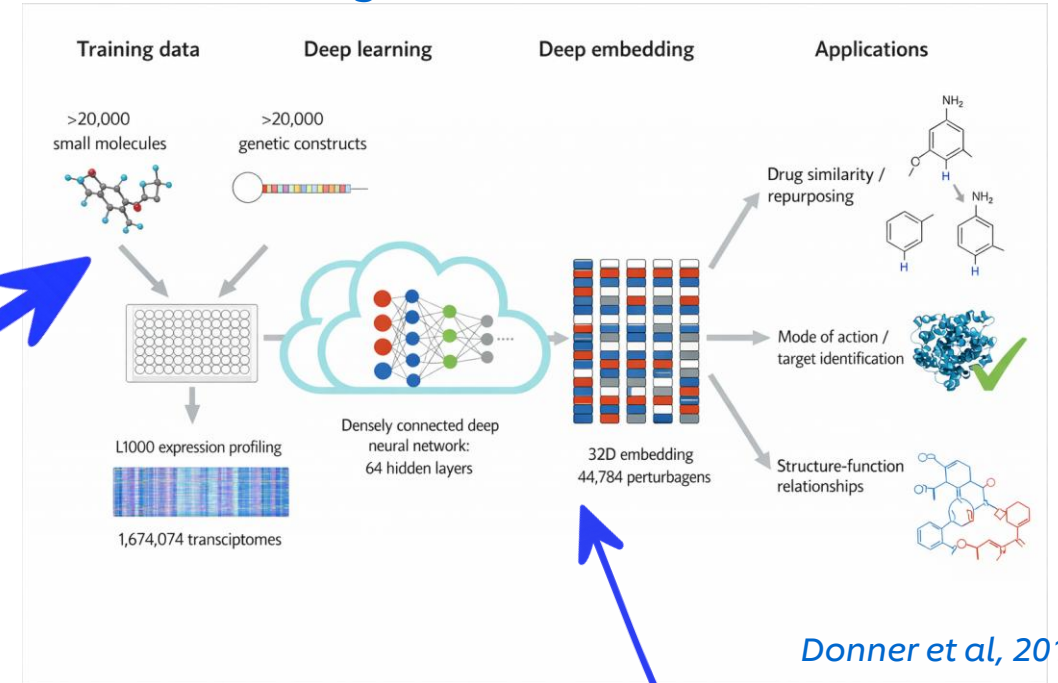
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Predictions/Decisions: Quantification of Biological Similarity at Scale/Read-Across



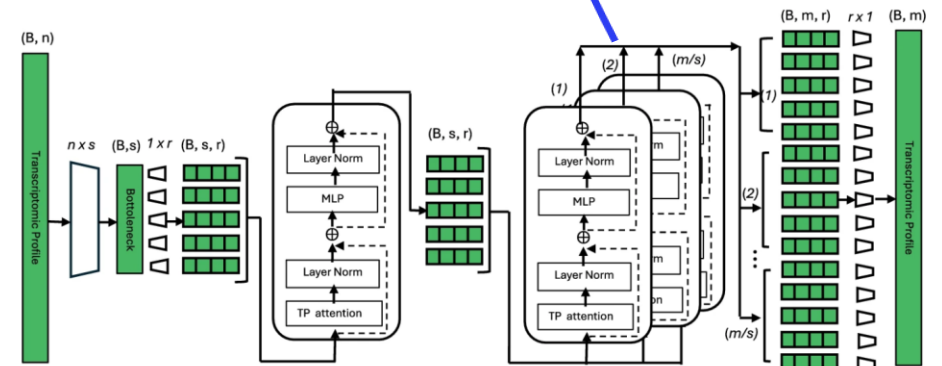
Berggren et al, 2017

Metric learning ...



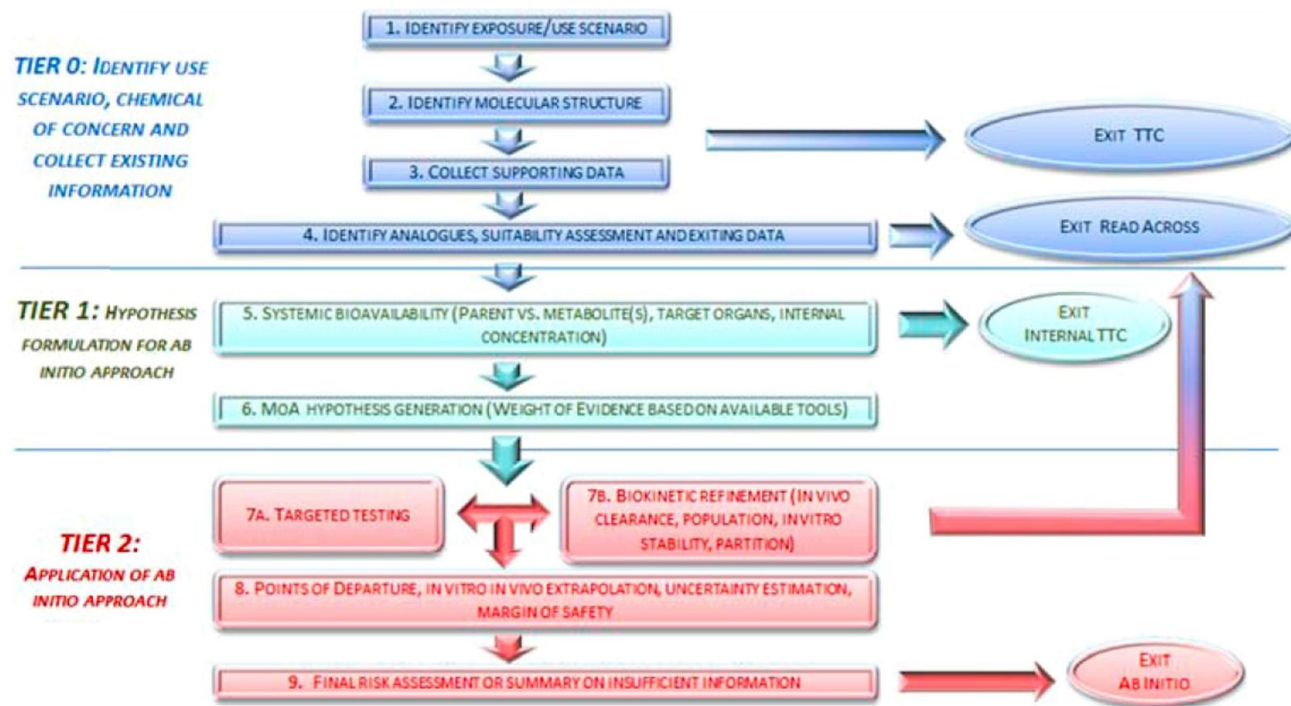
Donner et al, 2018

... across transcriptomics platforms



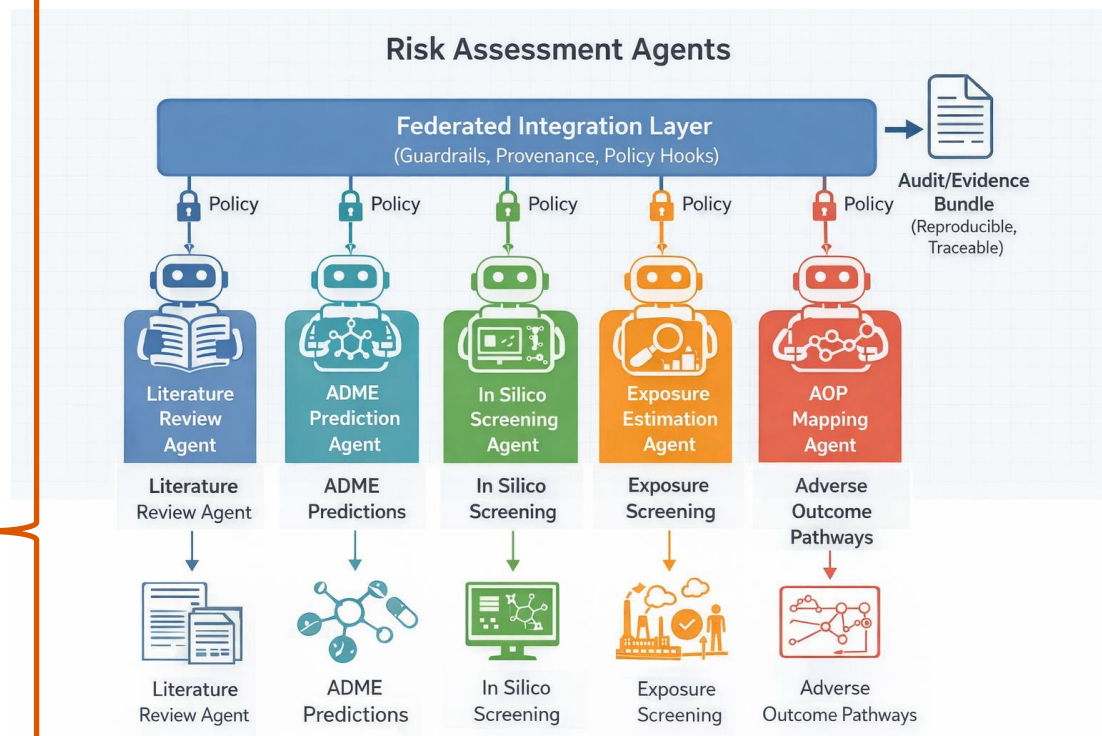
Cong et al, 2026

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Berggren et al, 2017

Automation of Tier 0 and Tier 1 workflows



Based on ToxMCP, Djidrovski, 2026

- Consistency and tractability of outcomes & decisions
- Enables application where specialised expertise was a barrier
- Increased productivity
- Holistic integration across expertise teams

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▶▶ Building confidence in AI-augmented NGRA workflows: Responsible adoption

Proportionate Governance

Adoption of AI requires proportional validation and governance based on clearly defined use case and potential scientific and regulatory impact.

Transparency and Traceability

AI-supported outputs should remain traceable to underlying evidence.

Reproducibility and Change control

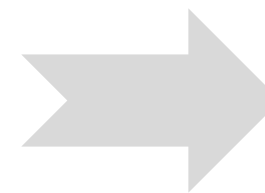
AI outputs should remain governable over time and variability should be monitored and controlled.

Human Accountability

AI should assist decisions with human oversight, clear responsibilities, and communication of uncertainty.

Data Governance and IP

AI use must comply with expectations relating to confidential information, data governance, secure handling of data, IP, licensing and liability.



Use **case studies** to build shared understanding and **practical guidance** on how to evaluate AI-augmented frameworks.

Failure Class	Description	Critical Impact
Epistemic Hallucination	Fabrication of plausible but factually incorrect content	Erroneous medical or military decisions based on false information
Overconfidence Failure	High-confidence presentation of incorrect outputs	Human operators accept errors without scrutiny
Abstention Failure	Inappropriate refusal to respond when a response is needed	System paralysis at critical decision points
Prompt Fragility	Output instability across semantically equivalent phrasings	Unpredictable system behavior in diverse operational conditions
Temporal Drift	Performance changes across model versions and time	Undetected reliability regression following post-deployment updates
Reasoning Collapse	Incoherence, repetition, or truncation under complex reasoning demands	Failure during time-critical operational tasks
Agentic Escalation	Autonomous execution of unsafe or unintended actions	Irreversible operational or physical consequences
Adversarial Manipulation	Prompt injection causing deviation from intended instructions	Command hijacking by deliberate adversaries



AI-augmented NGRA opportunities to Accelerate Phase out of Animal Testing for CSA: Areas where multi collaboration between regulators, industry and academia can help

Increased access to toxicological data that are FAIR

- Clear strategy on **shared infrastructure** - avoid fragmentation and siloing and work toward a unified machine-readable repository of legacy and NAM data (e.g. EBI/EMBL databases, ICE NTP curated database)
- Harmonise **data standards** - strengthen quality of data generation, transferring and processing (e.g. GIVIMP OECD 2018, standardized QC criteria), interoperability (e.g. OECD omics reporting templates)
- Coordinate efforts in high quality **NAM data generation** for large numbers of chemicals (e.g. OpenBind public/private consortia that powers next generation AI-based drug design, ToxCast/Tox21) and encourage pre-competitive data sharing

Collaborative validation, shared understanding and joint-confidence building

- Adopt **next generation validation** frameworks that go beyond performance metrics and include important governance principles
- Bridge the research-to-regulatory-use gaps for AI-augmented workflows e.g. commission **multi-stakeholder pilot projects for early, open and constructive engagement** and case studies to build confidence in priority areas
- Utilise **sandbox environments** where industry can test AI tools against clearly defined regulatory expectations

Facilitate training and capacity building on AI literacy for safety scientist, data scientists and regulators

Acknowledgements



Alistair Middleton, Maria Baltazar, Andrew White, Hugh Barlow, Patrik Engi, Mark Liddell, Alberto Locca, Leonardo Contreas, Mesha Williams, Katie Przybylak, Ramyaroban Kanapathywasam, Cameron Mackay, Gavin Maxwell, Julia Fentem



40+ years of developing non-animal safety science



70+ collaborations



600+ publications



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