



Enabling Al-driven Modeling and Simulation-based Decision making in Discovery Towards Increased Clinical Drug Candidate Success

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# Model-Informed Drug Development (MIDD) - Biosimulation



- The establishment of MIDD has been an *Evolution* over decades, generating incremental Efficiencies
- The culmination of years of scientific innovation has made quantitative medicine a reality
  - Clinical Trial Waivers
  - Embedded throughout the drug development process, supporting internal decision making



MIDD facilitated decision making in EVERY development program \$5M and 10 months savings per program



### Model Informed Drug Development (MIDD)

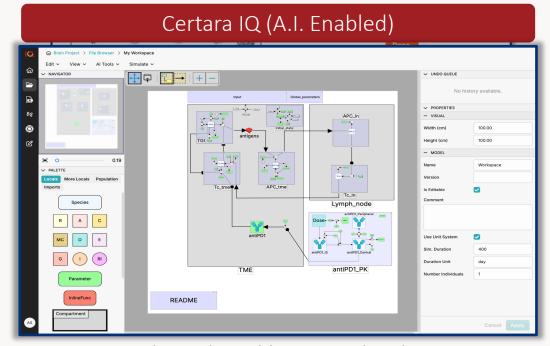
**Mechanistic modeling** approaches are able to simulate drug exposure (pharmacokinetics), target engagement, pharmacology modulation, efficacy and toxicity

Physiologically-based pharmacokinetic (PBPK) modeling



Commonly used to address **PK**-related questions (What the body does to the drug?)

Quantitative Systems Pharmacology (QSP) modeling



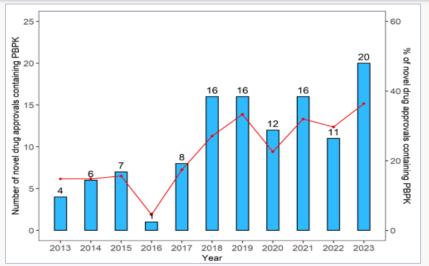
Commonly used to address **PD**-related questions (What the drug does to the body?)

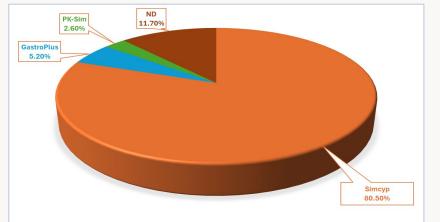


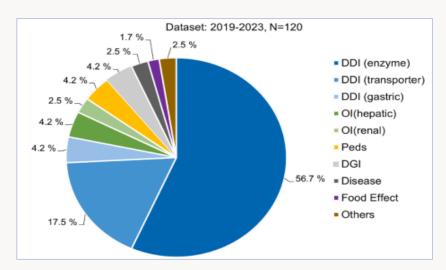
### Use of M&S in support of regulatory submissions is well established

• Generating supporting data, supporting label claims, and obtaining trial waivers etc









Simcyp has been utilized in more than 80% of FDAapproved drug applications involving PBPK modelling (2019-2023)

- Many DDIs use cases
- Increasingly used to inform dose in paediatrics, renally/hepatically impaired patients and to determine food effects



# PBPK Modeling Regularly Used to Support Label Claims

### 125+ novel drugs used the Simcyp Simulator in lieu of clinical studies

Oncology continued:

#### **ONCOLOGY**

AbbVie Venclexta (venetoclax) Agios Tibsovo (ivosidenib) Blincyto (blinatumomab) Amgen Lumakras (sotorasib) Amgen Ariad Alunbrig (brigatinib) Ariad (Takeda) Iclusig (ponatinib) Calquence (acalabrutinib) AstraZeneca AstraZeneca Lynparza (olaparib) AstraZeneca Tagrisso (osimertinib) AstraZeneca Trugap® (capvasertib) Beigene Brukinsa (zanubrutinib) Biohaven Nurtec (rimeaepant) BluePrint Medicines Ayvakit (avapritinib) Inrebic (fedratinib hydrochloride) Celgene Daiichi Sankvo Turalio (pexidartinib) Daiichi Sankyo Ezharmia (valmetostat tosilate) Daiichi Sankvo Vanflyta® (quizartinib dihydrochloride) Daiichi Sankyo Datroway (datopotamab deruxtecan-dlnk) Deciphera Qinlock (ripretinib) Lenvima (lenvatinib) EMD Serono Tepmetko (tepotinib hydrochloride) Alecensa (alectinib) Genentech Genentech Cotellic (cobimetinib) Gavreto® (pralsetinib) Genentech Genentech Polivy (polatuzumab vedotin-piiq) Genentech Rozlytrek (entrectinib) GSK Zejula (niraparib) Incyte Pemazyre (pemigatinib) Balversa (erdafitinib) Janssen Lazcluze (lazertinib) Janssen Erleada (apalutamide) Janssen Lilly Retevmo (selpercatinib) Lilly Verzenio (abemaciclib) Loxo Jaypirca (pirtobrutinib) Loxo Oncology Vitrakvi (larotrectinib) Menarini/Stemline Orserdu (elacestranto) Mirati Krazati (adaarasib) Farydak (panobinostat) Novartis Kisgali (ribociclib succingte) Novartis Scemblix (asciminib) Novartis Novartis Odomzo (sonidegib) Novartis Vijoice (alpelisib) **Novartis** Rydapt (midostaurin) Tabrecta (capmatinib) **Novartis** 

Zykadia (ceritinib) Novartis Novartis Jakavi (ruxolitinib) **Nuvation Bio** Ibtrozi (taletrectinib) Pfizer Daurismo (glasdegib) Pfizer Ibrance® (palbociclib) Pfizer Bosulif (bosutinib) Lorbrena (lorlatinib) **Pharmacyclics** Imbruvica (ibrutinib) **PumaDiabetic** Nerlynx® (neratinib) Sanofi Jevtana (cabazitaxel) Seattle Genetics Tukysa (tucatinib) Servier Voranigo (vorasidenib) Spectrum Beleodag (belinostat) Springworks Ogsiveo® (nirogancent) Syndax Pharmaceuticals Revuforj (revumenib) Takeda Exkivity (mobocertinib) Fruzagla® (fruguintinib) Lvtgobi (futibatinib) Copiktra (duvelisib) Verastem

#### RARE DISEASE

Agios Pyrukynd (mitapivat) AkaRx (Eisai) Doptelet (avatrombopag maleate) AstraZeneca Koselugo (selumetinib) Aurinia Lupkynis (voclosporin) Genentech Enspryng (satralizumab) Genentech Evrysdi (risdiplam) Global Blood Therapeutics Oxbryta (voxelotor) Intercept Ocaliva (obeticholic acid) Sohonus® (palovarotene) Kadmon Rezurock (belumosudil) Merck Welireg (belzutifan) Livmarli (maralixibat) Mitsubishi Tanabe Dysval (valbenazine) Novartis Isturisa (osilodrostat) Peloton/Merck Welireg (belzutifan) PTC Therapeutics Emflaza (deflazacort) Sanofi Genzyme Cerdelga (eliglustat tartrate) Soleno Therapeutics VYKAT™ XR (diazoxide choline) Sun Pharmaceutical Inc. Legselvi (deuruxolitinib) Travere Filspari (sparsentan) Vertex Symdeko (tezacaftor/ivacaftor) Trikafta (elexacaftor/ivacaftor/tezacaftor) Vertex

#### **CENTRAL NERVOUS SYSTEM**

AbbVie Rinvog (upadacitinib) AbbVie Qulipta (atogepant) Aristada (aripiprazole lauroxil) Alkermes Lybalvi (olanzapine/samidorphan) Alkermes Eisai Dayvigo (lemborexant) Idorsia Quviviq (daridorexant) Ponvory (ponesimod) Janssen Nourianz (istradefylline) Kyowa Kirin Lilly Reyvow (lasmiditan succinate) Novartis Mayzent (siponimod fumaric acid) **Novartis** Vanrafia (atrasentan) Pfizer Zavzpret (zavegepant) UCB Briviact (brivaracetam) Journavx (suzetriaine)

#### **INFECTIOUS DISEASE**

Gilead Veklury (remdesivir) GSK Blujepa (gepotidacin mesylate) Janssen Olysio (simeprevir) Merck Pifeltro (doravirine) Merck Prevymis (letermovir) Nabriva Xenleta (lefamulin acetate) Egaten (triclabendazole) Novartis Pfizer Paxlovid® (nirmatrelvir, ritonavir) Tibotec Edurant (rilpivirine) Cabenuva Kit (cabotegravir/rilpivirine)

#### **CARDIOVASCULAR**

Actelion (J&J)

BMS
Camzyos (mavacamten)
BridgeBio
Attruby (accramidis)
Johnson & Johnson
Pfizer
Revatio (sildenafil)

#### ENDOCRINE

AbbVie Orilissa (elagolix)
Astellas Veozah® (fezolinetant)
Esperion Nexetol (bempedoic acid)
Janssen Invokana (canaglifiozin)
Lilly Olumiant (baricitinib)
Lilly Mounjaro (tirzepatide)
Merck Steglatro (ertugliflozin)

#### **OTHER**

Galderma Aklief (trifarotene)
Gilead Livdelzi (seladelpar)
Takeda Livtencity (maribavir)
Vertex Alyftrek (vanzacaftor, tezacaftor, and deutivacaftor)

#### **GASTROENTEROLOGY**

AstraZeneca Farxigo (dapaglifoxin)
AstraZeneca Movantik (naloxegol)
Helsinn Akynzeo (fosnetupitant/palonosetron)
Phathom Voquezna TriplePak (vonoprazan/amoxicillin/clarithromycin)
Shionogi Symproic (naldemedine)
Shire Motegrity (prucalopride)

**Updated July 2025** 



## PBPK modeling used to predict "complex DDI" scenarios

- Recently we are seeing many more projects with complex DDI scenarios
  - For example, where the drug is a substrate for CYP3A4, an inhibitor of CYP3A4 (competitive and time dependent)
     and an inducer of CYP3A4
  - Time dependent non-linear PK and complex DDI scenarios
  - DDI liability may be different on single dose versus multiple dose
  - Extensive use of itraconazole, rifampicin and midazolam studies to build and verify the models
- PBPK modelling is really the only option to understand the complexity and is being used successfully in lieu
  of DDI studies













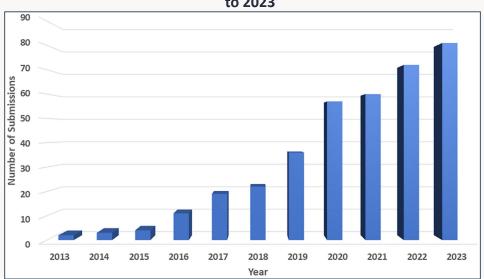


# The Rise of QSP

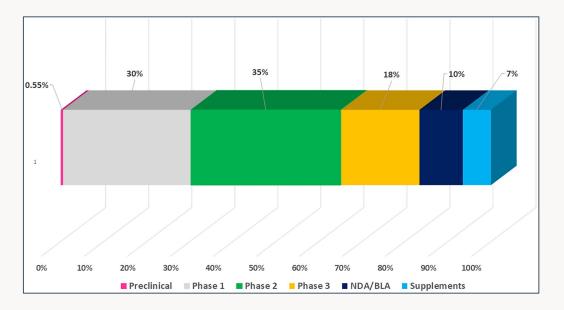
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Landscape of regulatory quantitative systems pharmacology submissions to the U.S. Food and Drug Administration: An update report

Jane P. F. Bai | Guansheng Liu | Miao Zhao | Jie Wang | Ye Xiong | Tien Truong | Justin C. Earp | Yuching Yang | Jiang Liu | Hao Zhu | Gilbert J. Burckart
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### Yearly trend of quantitative systems pharmacology submissions from 2013 to 2023







- Majority (65%) of QSP submissions were for Phase I and Phase II
- NDA and BLA submissions plus post-approval submissions (supplements) were 17% of the total submissions



# QSP Modeling for Human Dose Prediction

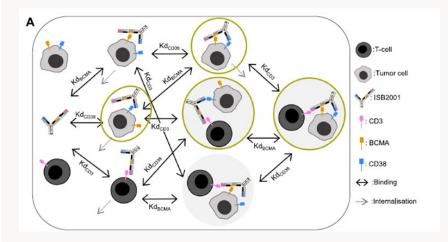


#### **Background/Challenge**

- ISB2001 is a first-in-class, tri-specific mAb CD3 T-cell engager co-targeting BCMA and CD38 for multiple myeloma
- Conventional "MABEL"\* approaches typically lead to very low FIH starting dose
- ISB 2001 lacks cross-reactivity to monkey -> no preclinical studies conducted
- Animal models may not translate to complex patient pathophysiology

#### Solution

- QSP modeling to generate human predictions based on preclinical in vitro data
- Calibrated/validated with competitor clinical data (teclistamab)



#### nature cancer

Articl

https://doi.org/10.1038/s43018-024-00821-1

ISB 2001 trispecific T cell engager shows strong tumor cytotoxicity and overcomes immune escape mechanisms of multiple myeloma cells

#### **Result and Impact**

- QSP allowed for 50-100x higher FIH starting dose compared to conventional MABEL
- Approved by multiple regulatory agencies
- Model predicts superiority (lower dose) compared to teclistamab
- QSP model predictions were clinically validated

"Despite the absence of monkey PK and toxicology data, this QSP-guided approach successfully predicted an optimal FIH dose, clinical PK, safety and efficacy, while minimizing patient exposure to non-therapeutic doses."



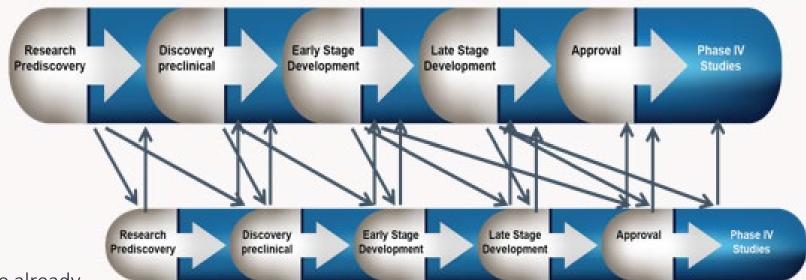
# Biosimulation Embedded Throughout Development Programs

The commercial value of "Regulatory Wins" is compelling but arguably, making modelling integral to decision making throughout the drug development cycle is where the magic happens

#### (PBPK, QSP, QSTS, PK/PD, popPK)

#### Virtual

Drug development program



#### Actual

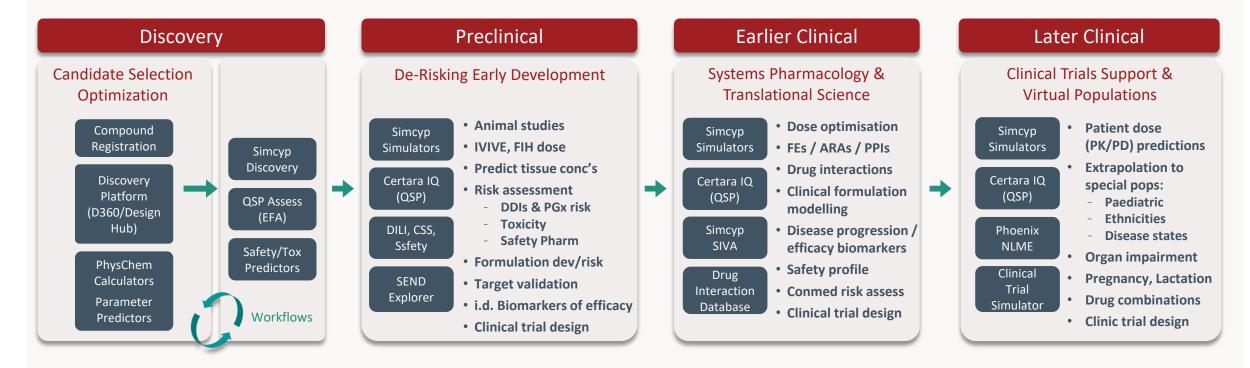
Drug development world

- Taking advantage of events that have already happened in the virtual world
- Ability to move faster, and more predictably and reliably



### Certara MIDD Platform

Data Integration & Predictive Analytics Delivering Certainty Across Drug Development

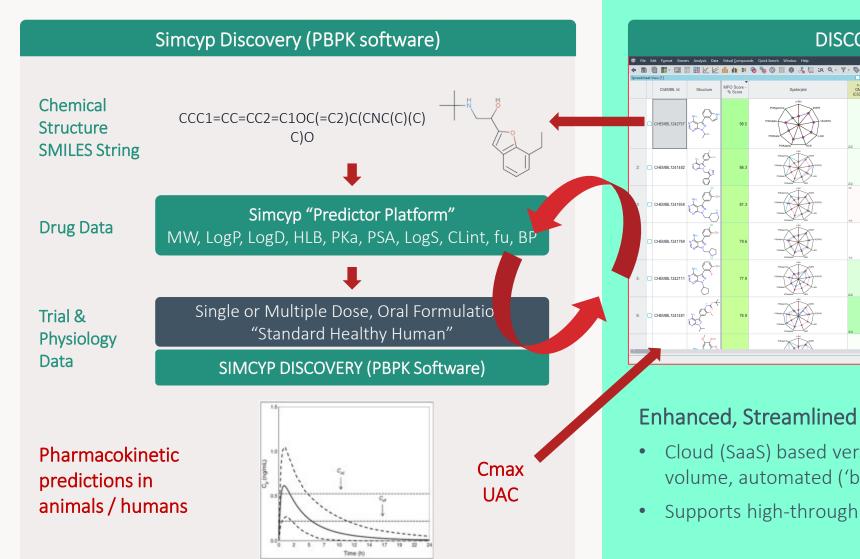


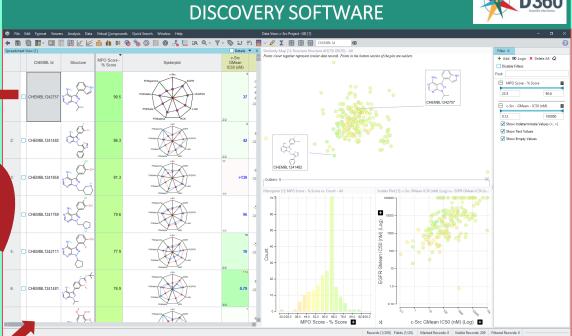
#### "In-Silico Profile" concept

- Unique library of data which defines/characterises a compound and provides input parameters for in-silico predictions
- Compound Profile expands and transform over time as experimental data is generated and accumulated
- Standardised data formats allow predictive models to be run as automated workflows across large numbers of compounds and test scenarios



### Integrating Simcyp and Database workflows



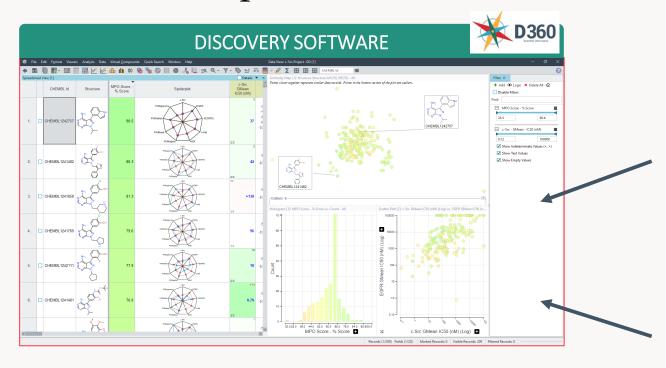


### Enhanced, Streamlined Candidate Selection!

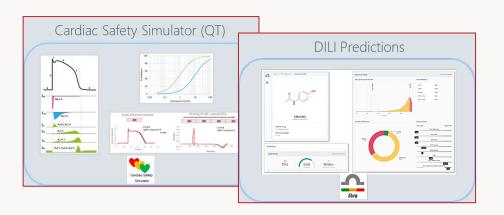
- Cloud (SaaS) based version of Simcyp Discovery, enables high volume, automated ('batch') workflows for large datasets
- Supports high-throughput analysis



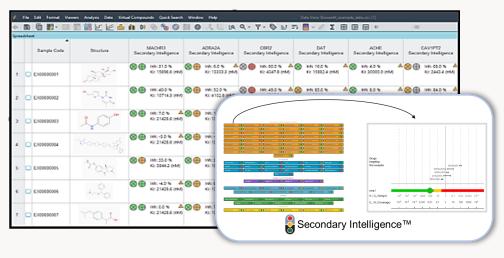
# Other Example Workflows



- Secondary intelligence is a risk assessment tool based on secondary pharmacology assay data
- Risk can be displayed in terms of traffic lights
- Useful in prioritizing compounds using D360's ability to assess compounds with multi-parameter scoring



Input parameters required to generate early DILI / cardiac safety risk predictions collected early in Discovery (data also used to improve/train models)





# Early Feasibility Assessment (EFA)using QSP Modeling

Platform-based bio-simulation workflow to address key questions in early discovery



What is the optimal target in a biological pathway?

Is it better to target the ligand or the receptor?

Is it feasible to achieve the intended pharmacology in the clinic?

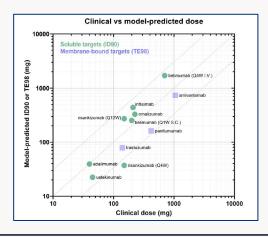
What are the required drug properties to achieve the desired pharmacology at feasible doses?

#### FIT FOR PURPOSE

Aligned with drug discovery requirements and cycle times

- Consistent, reliable
- Turnaround days-weeks
- EFA requires no in vivo animal data

#### **VALIDATED**



#### **IMPACT**

- Shorten discovery timelines
- Better clinical candidates
- Kill early: redirect resources to back the winners

#### RETURN ON INVESTMENT

EFA at scale can save \$10-\$100M at portfolio level



### AZ Retrospective Review (July 2025)

Translational PK/PD: a retrospective analysis of performance and impact from a drug portfolio

Rasmus Jansson-Löfmark <sup>1</sup>,\*, Markus Fridén <sup>2,5</sup>, Lassina Badolo <sup>2</sup>, Christine Ahlström <sup>1</sup>, Ian Gurrell <sup>4</sup>, Menelas N. Pangalos <sup>6</sup>, Rhys DO Jones <sup>3</sup>,\*

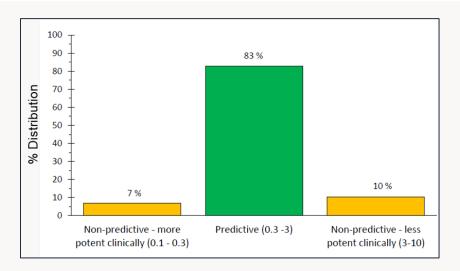
(reviewed compounds nominated as candidates 2007-2019)

- Right target
- Right tissue/exposure
- Right patient
- Right safety
- Right commercial

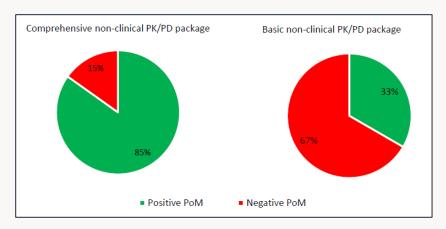
PBPK / QSP / ER modelling can be used define the level of target engagement expected to be necessary for clinical activity, the required exposure profile and the required dose to achieve this

**Basic translational PK/PD package -** relied solely on in-vitro potency without considering prior knowledge of the target, or consideration for local tissue exposure

Comprehensive translational PK/PD package – projected clinical efficacy used a biomarker (clinical PD) model with quantitative assessment of PK/PD translation



Translational PK/PD modelling with non-clinical datasets can successfully predict E/R for target engagement in humans (83% of compounds had drug exposure-response within a threefold prediction accuracy)



Projects with robust PK/PD packages achieved an 85% success rate in PoM compared with 33% for those with basic packages



### Genentech

- Use of PBPK to prioritise molecules with the desired PK profiles
- Physchem and in-vitro data only, with no compound specific fitting (with invivo data)



pubs.acs.org/jmc

Article

#### Human-Focused Multiparameter Optimization Scores for Rank Ordering Compounds during Early Drug Discovery: Validation of PBPK Models Based on Clinical PK Data

Yanran Wang,\*<sup>,⊥</sup> Wenyi Wang,<sup>⊥</sup> Fabio Broccatelli, Jane R. Kenny, Matthew R. Wright, Jon Sorenson, and Prashant Desai\*



Cite This: https://doi.org/10.1021/acs.jmedchem.5c01707



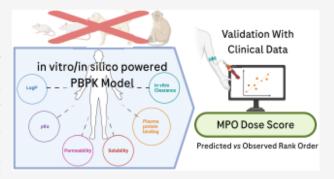
ACCESS

III Metrics & More

Article Recommendations

Supporting Information

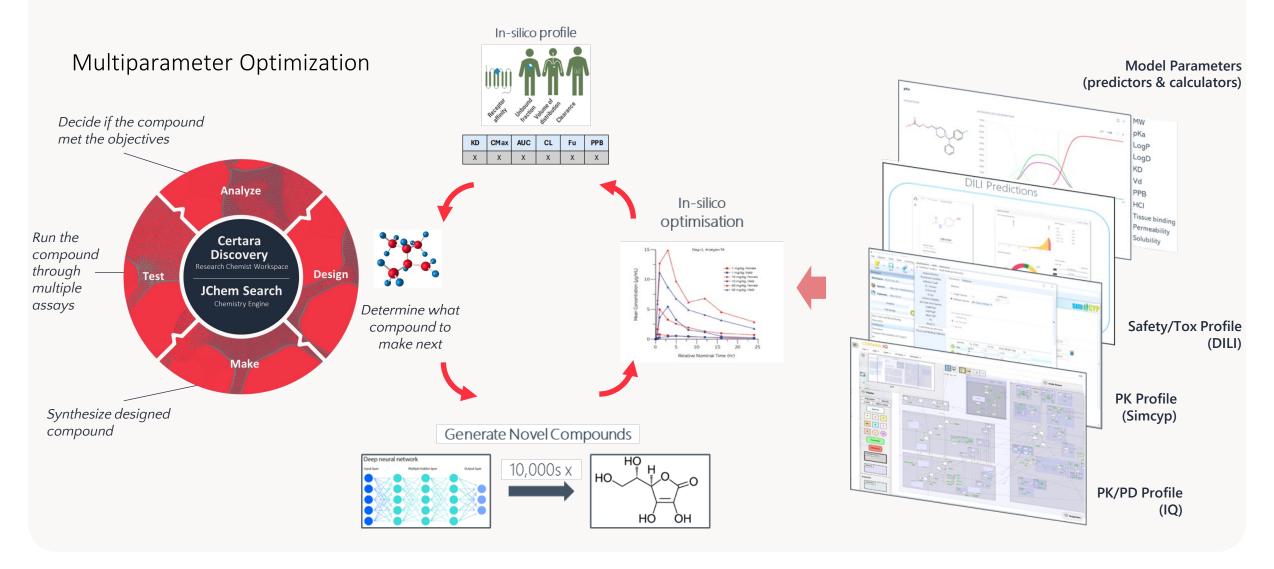
ABSTRACT: Physiologically based pharmacokinetic (PBPK) models are increasingly used in drug discovery to prioritize compounds that meet the desired pharmacokinetic (PK) profiles. We developed a generalized PBPK model using only early discovery in vitro data and validated it across 18 Genentech compounds without compound-specific fitting. The model effectively rank-ordered compounds based on hypothetical PK drivers of pharmacodynamics, including minimum and maximum unbound concentrations ( $C_{\min}$  and  $C_{\max}$ ) and unbound area under the curve (AUCu). In contrast, ranking based on any single in vitro parameter alone was less predictive. Additionally, the model provided reasonable predictions of clinical PK parameters such as apparent clearance, volume of distribution, Cmax, AUCinf, and full



concentration—time profiles. This work represents the first validation of clinical PK prediction using early discovery data in a bottom-up manner and demonstrates the potential of PBPK modeling as a multiparameter optimization tool to guide the selection and optimization of compounds in the early stages of drug discovery.



### In-silico Models Can Enhance The Design Process in Discovery





# Introducing Certara "Nexus"

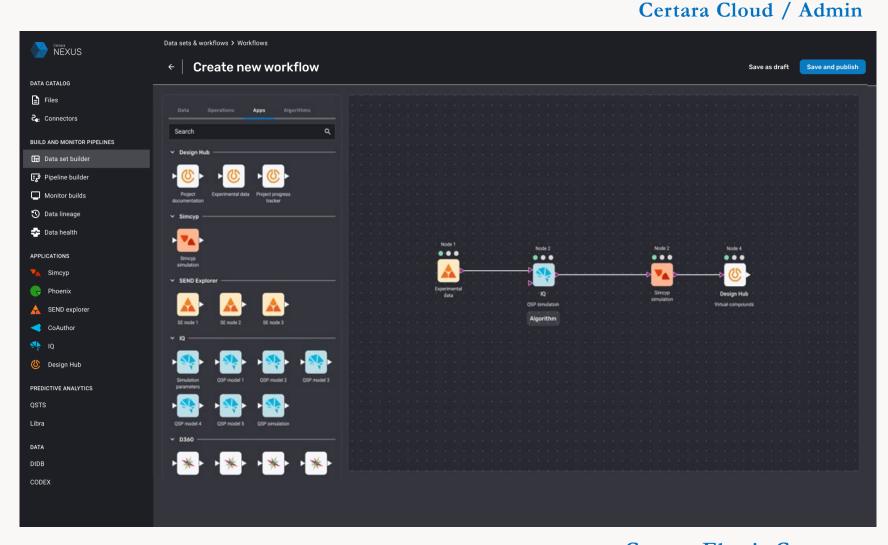
#### Certara Layar Software

- Creates an Integrated Data Catalog
- Security, privileging, clientspecific data integration
- Configurable LLM model architectures
- Integration of structured and unstructured data
- AI For Automated Structured Data Mapping
- Supports Multi-Agent AI Frameworks

#### Certara Software

- Software Applications
- Data Engines
- Predictive Anlaytics Tools
- Proprietary Data Sets

Integrated Third Party Software, Applications, Data Sets

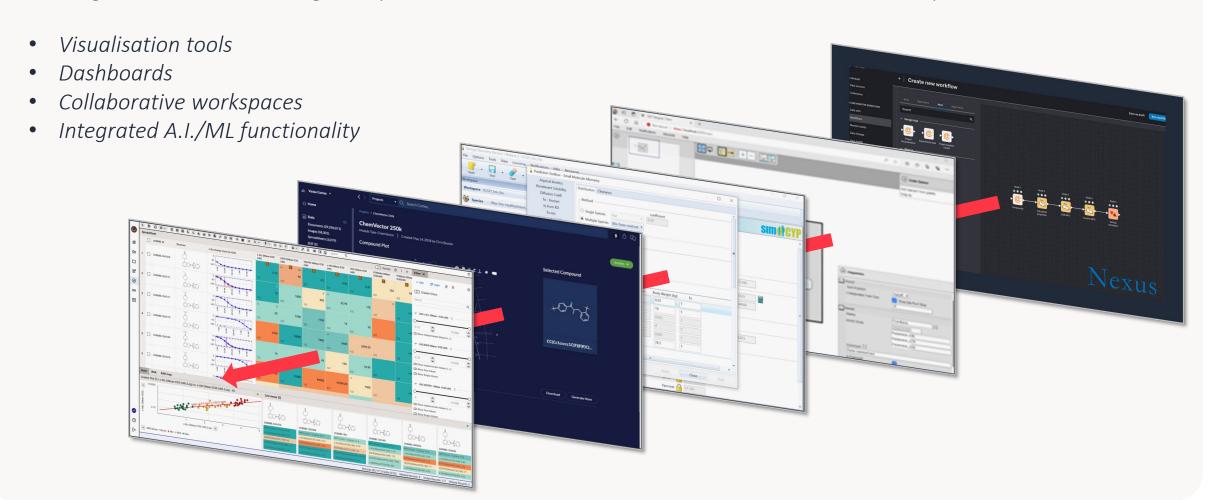


Certara Elastic Compute



### Certara MIDD Platform

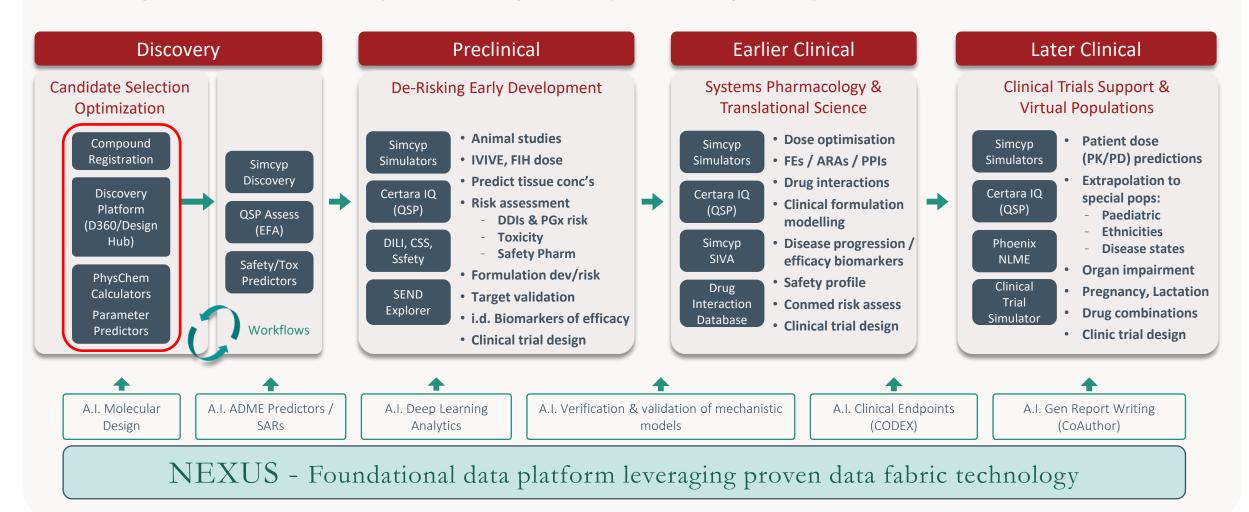
Pairing front-end modelling/analytics software with a back-end data orchestration layer





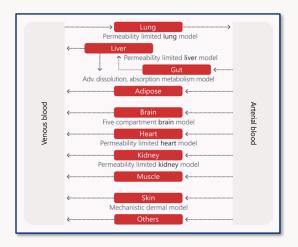
### Certara MIDD Platform

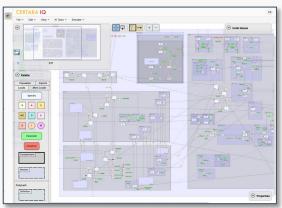
Data Integration & Predictive Analytics Delivering Certainty Across Drug Development





### Why Use MIDD in Drug Discovery?





- Define lab objectives to achieve in-vivo (human)TPP
- Use of PBPK/QSP to prioritise molecules with the desired PK/PD profiles
  - Early PK/PD & FIH dose predictions
  - DD risk assessment
  - Early formulation screening
- Prediction of exposure used in early tox studies



### Final Comments

Applying mechanistic modeling early provides an opportunity to reduce attrition rates post-Discovery

• Multi-parameter candidate selection targeting a human in-vivo Target Product Profile

The measure of success for these models should not be accuracy, but their ability to (i) increase the probability of successfully advancing a drug candidate (ii) filling knowledge gaps in the decision-making process

• Something is better than nothing to support decision making

### Workflows can improve efficiencies across internal 'silos'

• A shared platform can bring together Modelers, DMPK scientists, Clinical Pharmacologists, Medicinal Chemists and Toxicologists, leveraging MIDD to fill knowledge gaps

#### Moving into the Clinic, models are ...

- Enhanced as more data becomes available, improving their predictive accuracy and reliability
- Accurate enough to answer "what if" scenarios at each stage in the lifecycle of the drug
- Validated to enable extrapolation across populations
- Robust enough to generate data in support of regulatory submissions and label claims
- Re-usable on further support of the drug post-approval

#### Discovery/Nonclinical **Early Development** Animal to human extrapolation · First-in-human single/multiple Drug-drug interactions Early formulation assessment dose exposure Pediatric/organ impairment modelling Drug-drug interactions VBE simulations Early drug interaction risk · Absorption, food effect, ARA and Label claims in lieu of clinical study formulation bridging Pregnancy/Lactation simulations · First-in-human dose prediction "Learn and confirm" with continuous Model Refinement, Verification and Validation



# Thank You



