

Reproducible Digital Twins

for Personalized & Stratified Treatment



Prof. Dr. Matthias König

Systems Medicine, Digital Twins & AI

<https://livermetabolism.com>

Metabolic Inflammation and Carcinogenesis of the Liver

University Hospital Schleswig Holstein, Campus Lübeck, First Department of Medicine

Head of Systems Medicine of the Liver Lab

Humboldt-Universität zu Berlin, Institute of Biology

2026-08-25, EKF MSG Seminar Series

We build open, FAIR **digital twins** of human physiology – AI-powered models that predict disease and therapy, patient by patient.



Digital Twins

Physiologically based models that mirror individual patients, from molecule to whole body.



AI

Mechanistic modeling meets machine learning for predictive, personalized medicine.



Digital Pathology

AI-driven analysis of whole-slide histology to quantify liver structure and disease at scale.



Pharmacometrics

Physiologically based pharmacokinetic/ pharmacodynamic models for precision dosing.



Open & FAIR

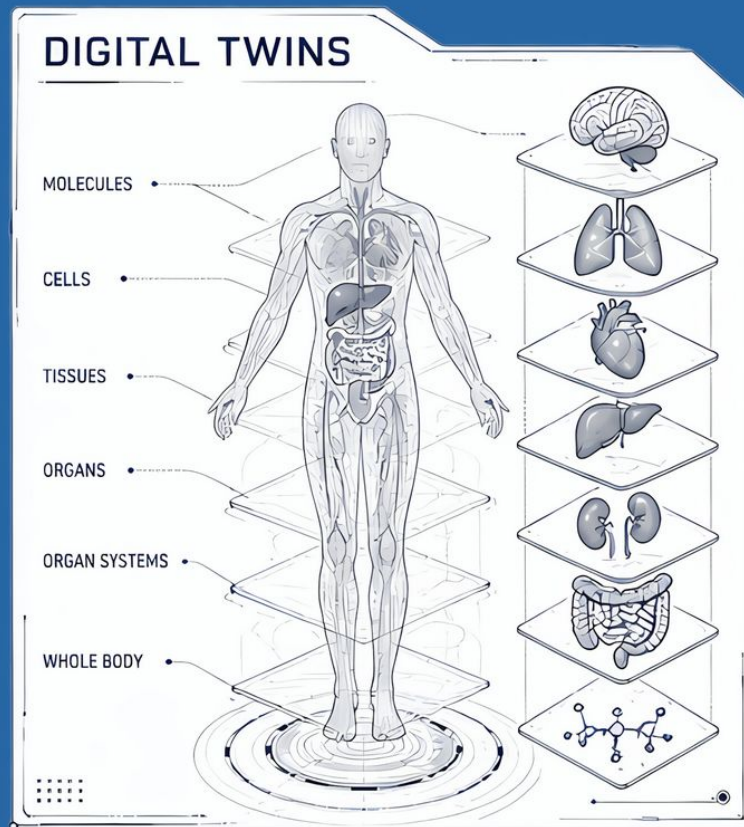
Reproducible, standardized models and data that the community can build on.



Digital Twins

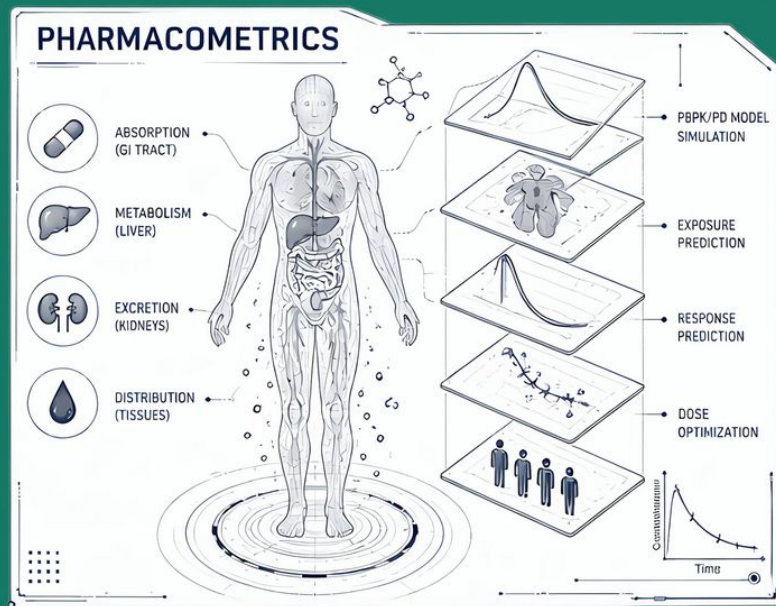
Physiologically based models that mirror individual patients, from molecule to whole body.

Every patient becomes a model. We build physiologically based digital twins — living simulations that mirror an individual from molecule to whole body — so care can be planned before it is given.



- Eine **virtuelle Repräsentation eines Patienten**, die multidimensionale, patientenspezifische Informationen enthält.
- **Mechanistische Computermodelle**, die mit Patientendaten personalisierte Vorhersagen erlauben.
- Dient zur **Unterstützung medizinischer Entscheidungen**.





Pharmacometrics

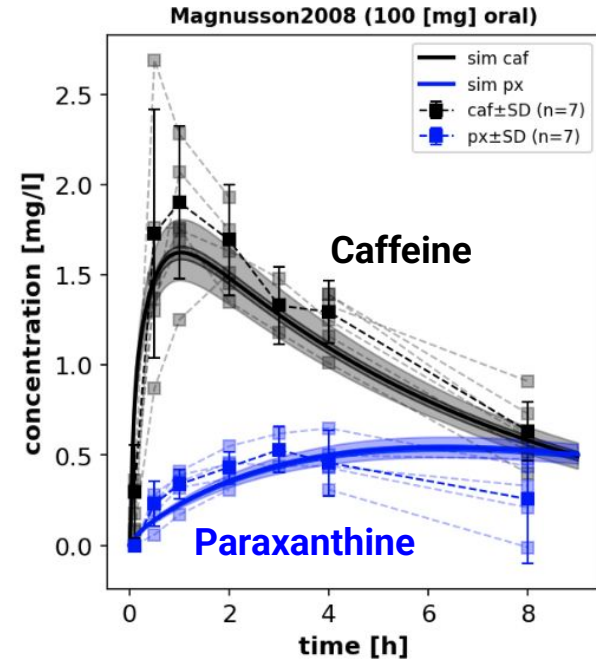
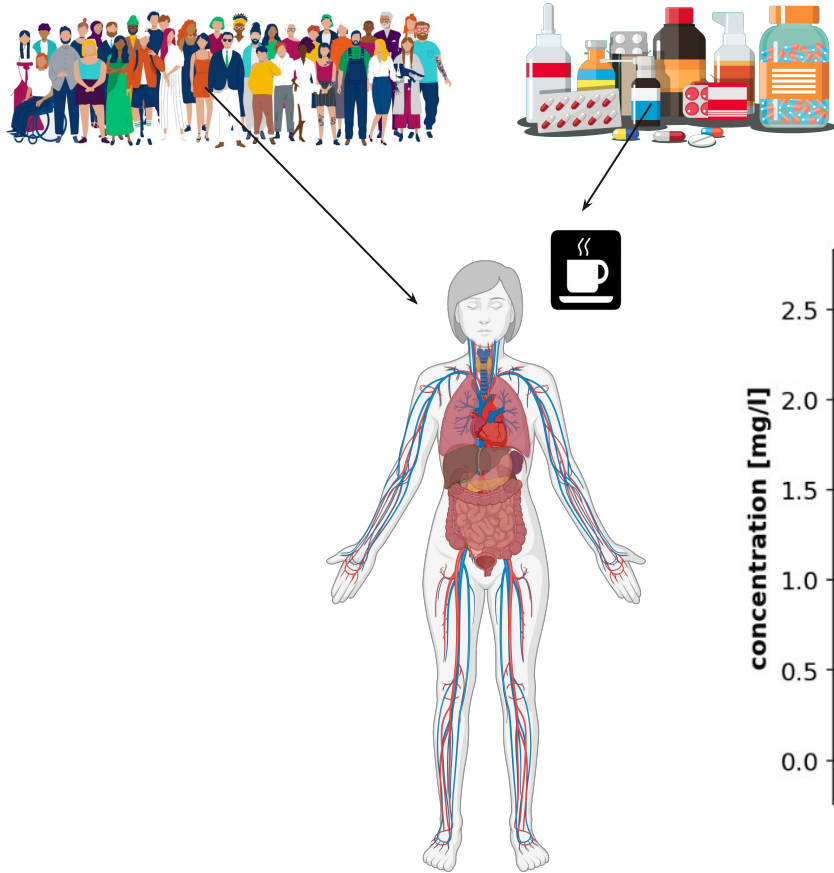
Physiologically based pharmacokinetic/ pharmacodynamic models for precision dosing.

The right dose is never one-size-fits-all. Our PBPK/PD models simulate how each body absorbs, distributes, and clears a drug, turning population averages into individual precision.





Pharmakokinetik von Medikamenten



Physiologisch basierte Pharmakokinetik (PBPK)-Modelle

Digitaler Zwilling

- Menschliche Physiologie *in silico*

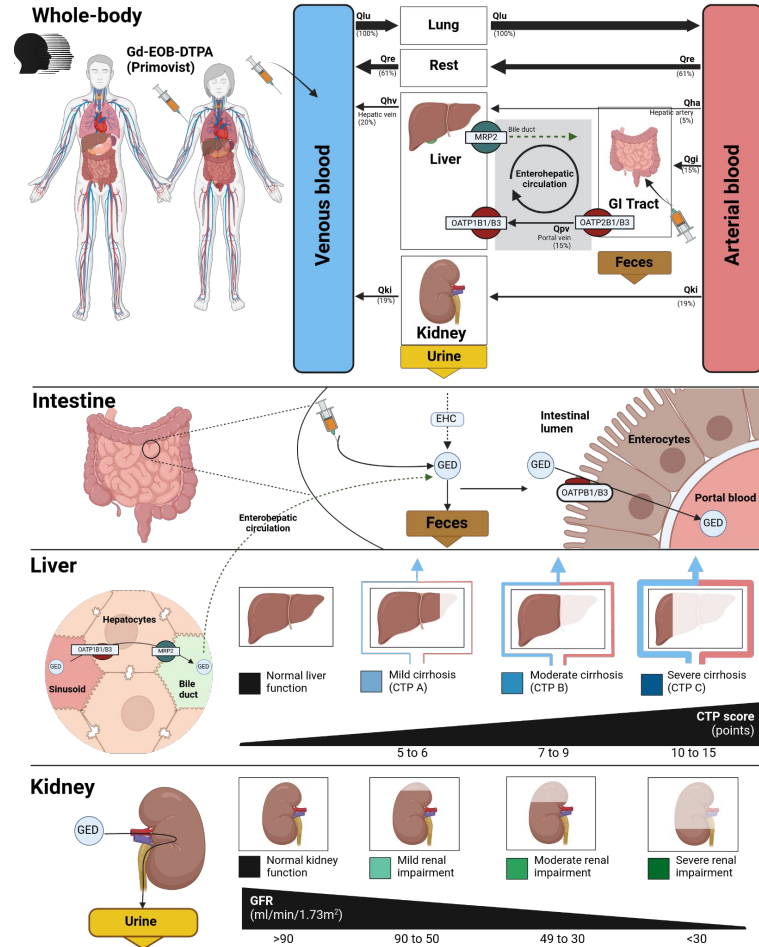
ADME

- Absorption
- Distribution
- Metabolismus
- Elimination

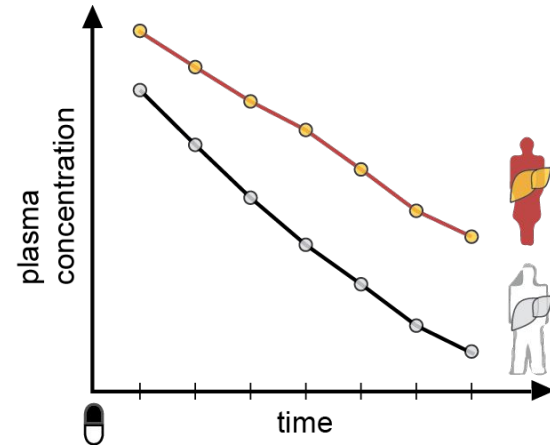
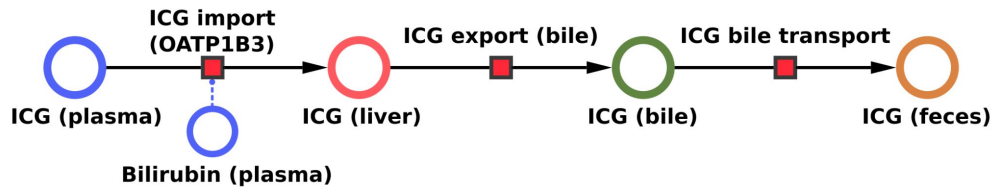
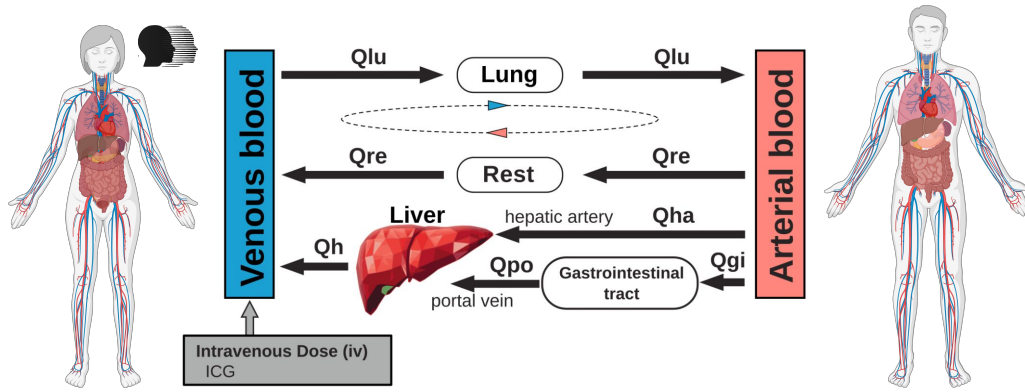
Multi-Skalen Modelle

Hohe klinische Relevanz

- Individualisierung & Stratifizierung
- Pathophysiologie



Leberfunktionstest: Indocyanine green (ICG)



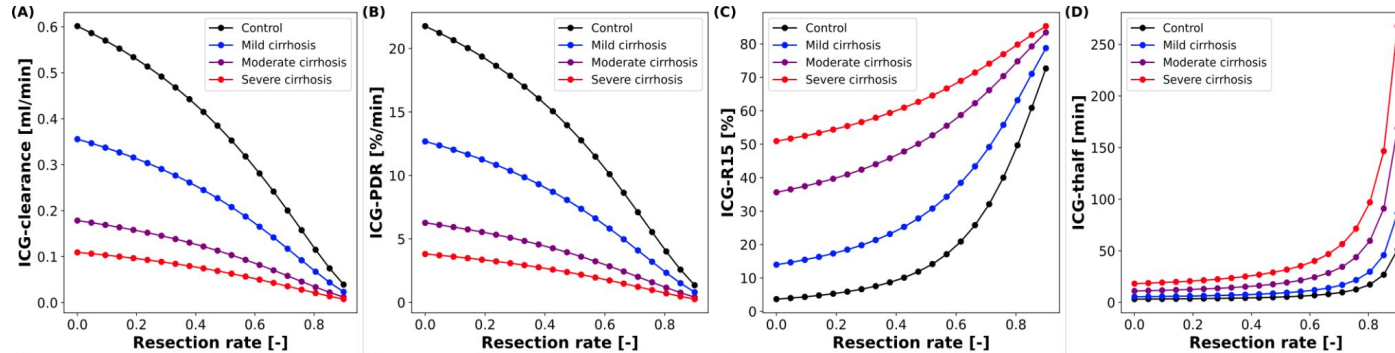
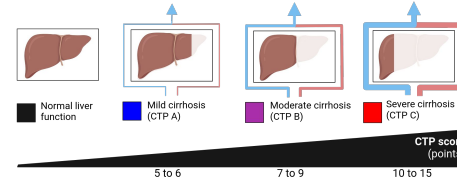
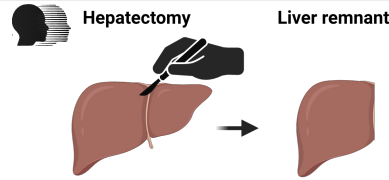
- **Anthropometrischen Faktoren** (Alter, Gewicht, Geschlecht)
- **Physiologischen Faktoren** (Blutfluss, Lebervolumen)
- **Lebererkrankung** (Zirrhose)
- **Operativen Eingriffen** (Hepatektomie)

Prediction of survival after hepatectomy using a physiologically based pharmacokinetic model of indocyanine green liver function tests. A Köller, J Grzegorzewski, MH Tautenhahn, M König. Front. Physiol., 22 November 2021; doi: [10.3389/fphys.2021.730418](https://doi.org/10.3389/fphys.2021.730418)

Physiologically based modeling of the effect of physiological and anthropometric variability on indocyanine green based liver function tests. A Köller, J Grzegorzewski, M König. Front Physiol. 2021 Nov 22;12:757293. doi: [10.3389/fphys.2021.757293](https://doi.org/10.3389/fphys.2021.757293). eCollection 2021.



In silico Hepatektomie



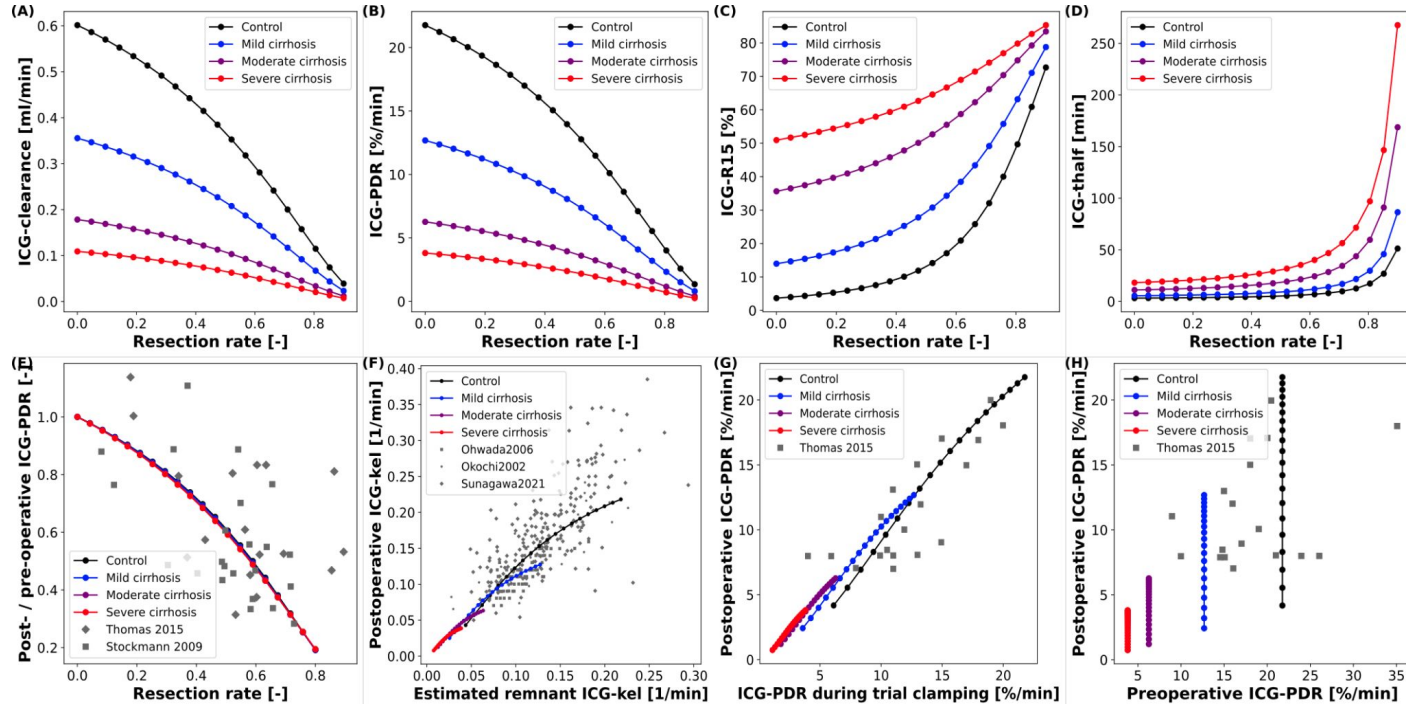
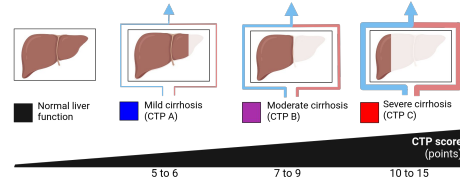
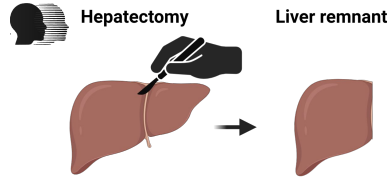
A Köller, J Grzegorzewski, MH Tautenhahn, **M König**
Prediction of survival after hepatectomy using a physiologically based pharmacokinetic model of indocyanine green liver function tests.

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Validierung



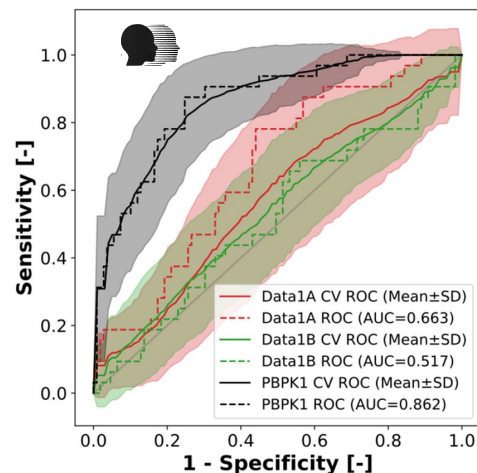
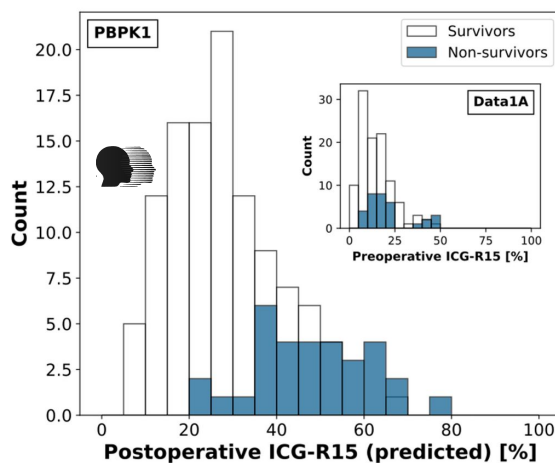
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Risikovorhersage nach Hepatektomie



Vorhersage mit
Digitalem Zwilling
(PBPK) ist besser
als nur Daten.

TABLE | Evaluation metrics for classification models of survival after hepatectomy.

Classification model	Data1A	Data1B	PBPK1
Features	Preoperative ICG-R15	Postoperative ICG-R15 (calculated)	Postoperative ICG-R15 (predicted)
ROC AUC	0.663 (0.555 ± 0.072)	0.517 (0.481 ± 0.052)	0.862 (0.753 ± 0.090)
Balanced accuracy	0.562 (0.555 ± 0.072)	0.515 (0.481 ± 0.052)	0.761 (0.753 ± 0.090)
F1-score	0.267 (0.243 ± 0.152)	0.143 (0.118 ± 0.126)	0.611 (0.587 ± 0.136)
Precision (PPV)	0.462 (0.443 ± 0.295)	0.300 (0.192 ± 0.227)	0.550 (0.538 ± 0.152)
Recall	0.188 (0.182 ± 0.133)	0.094 (0.170 ± 0.273)	0.688 (0.681 ± 0.172)
NPV	0.797 (0.792 ± 0.067)	0.779 (0.745 ± 0.133)	0.901 (0.898 ± 0.057)

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Digitale Zwillinge für viele Medikamente



Physiologically based pharmacokinetic (PBPK) modeling of the role of CYP2D6 polymorphism for metabolic phenotyping with dextromethorphan. J.Grzegorzewski, J.Brandhorst, **M.König**. Front. Pharmacol. 2022 Oct 24;13:1029073. doi:10.3389/fphar.2022.1029073.

Prediction of survival after hepatectomy using a physiologically based pharmacokinetic model of indocyanine green liver function tests. A Köller, J Grzegorzewski, MH Tautenhahn, **M König**. *Front. Physiol.*, 22 November 2021; doi: [10.3389/fphys.2021.730418](https://doi.org/10.3389/fphys.2021.730418)

Physiologically based modeling of the effect of physiological and anthropometric variability on indocyanine green based liver function tests. A Köller, J Grzegorzewski, **M König**. *Front Physiol.* 2021 Nov 22;12:757293. doi: [10.3389/fphys.2021.757293](https://doi.org/10.3389/fphys.2021.757293).

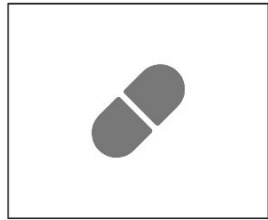
A physiologically based pharmacokinetic model for CYP2E1 phenotyping via chlorzoxazone. J. Küttner, J. Grzegorzewski, HM. Tautenhahn, **M. König**. bioRxiv 2023.04.12.536571 (preprint). doi:[10.1101/2023.04.12.536571](https://doi.org/10.1101/2023.04.12.536571)

Pharmacokinetics of caffeine: A systematic analysis of reported data for application in metabolic phenotyping and liver function testing. J.Grzegorzewski, F.Bartsch, A.Köller, and **M.König**. *Frontiers in Pharmacology* 2022, Vol12; doi: [10.3389/fphar.2021.752826](https://doi.org/10.3389/fphar.2021.752826)

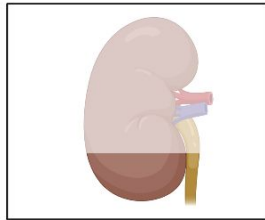
A physiologically based pharmacokinetic (PBPK) model of pravastatin: Impact of hepatorenal impairment and genetic polymorphisms of OATP1B1, OATP2B1 and MRP2. HL Pujol, J Grzegorzewski, F Bartsch, HM Tautenhahn, **M.König**. [submitted]
A Physiologically-Based Pharmacokinetic Model of Tirzepatide, Internship Report Abhinav Mishra (supervisor: Matthias König), Internship Report, Mar 2025

- Gd-EOB-DTPA
- Indocyanine green (OATP1B3)
- Caffeine (CYP1A2)
- LIMAX (CYP1A2)
- Creatine, creatinine, inulin
- Omeprazol (CYP2C19)
- Pravastatin (OATP1B1)
- Metacetin (LiMAX, CYP1A2)
- Talinolol (P-Glycoprotein)
- Chlorzoxazone (CYP2E1)
- Paracetamol
- Metoprolol (CYP2D6)
- Simvastatin (OATP1B1)
- Midazolam (CYP3A4)
- Galactose
- Codeine/Morphine
- Ramipril, lisinopril, enalapril, captopril
- Sorafenib
- Losartan
- Semaglutide, tirzapeptide,
Glucose, Insulin, C-Peptide, Glucagon, FFA

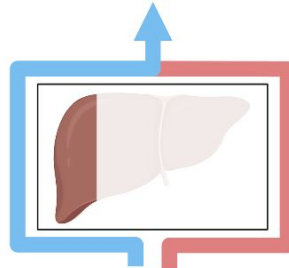
Anwendungsbeispiele



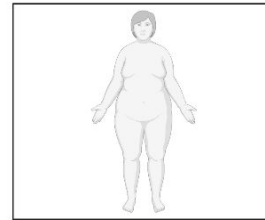
 Dose



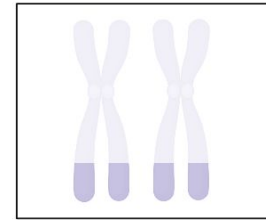
 Renal impairment



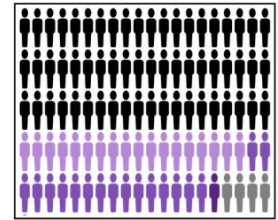
 Cirrhosis



 Bodyweight

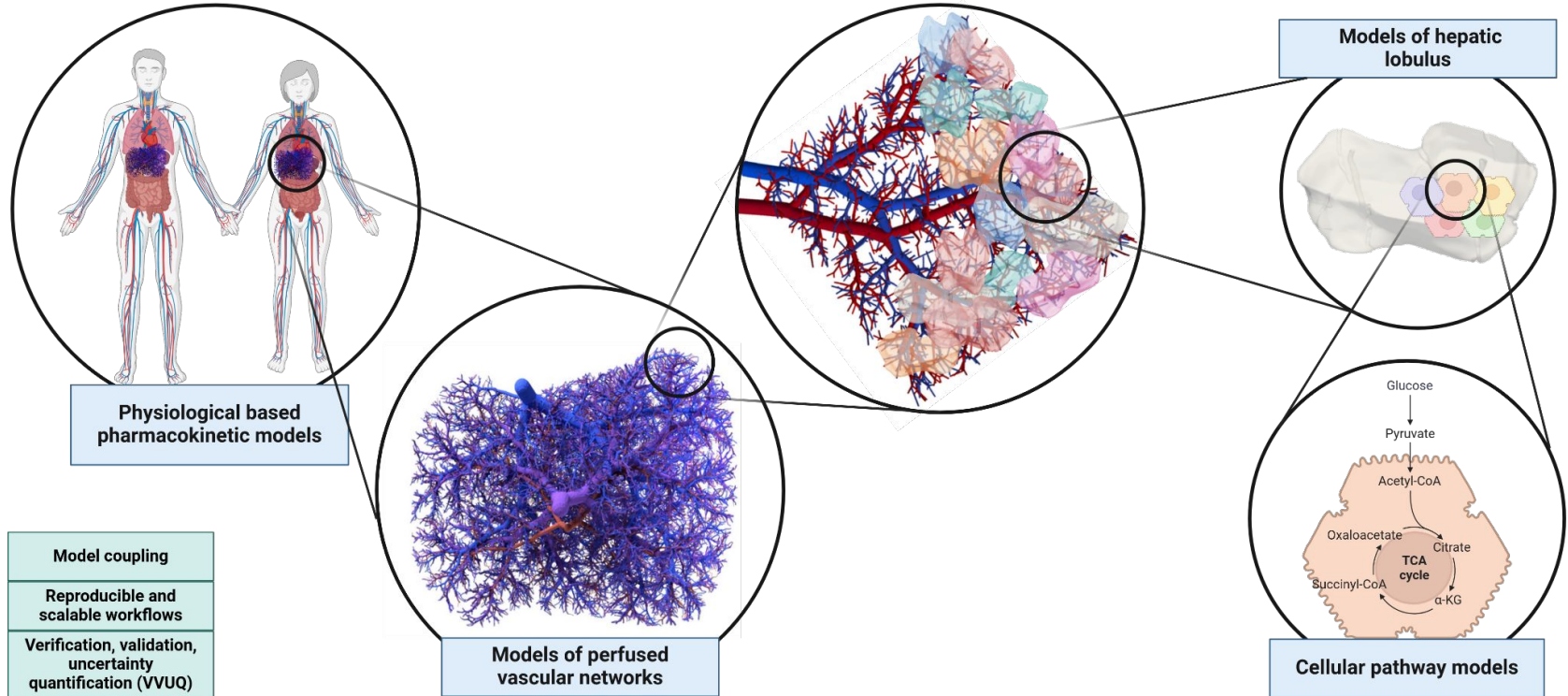


 CYP2C9 genotypes



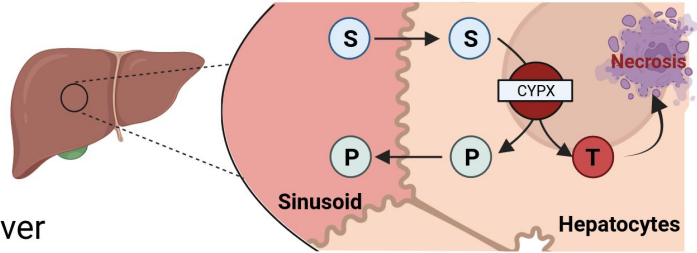
 Populations (CYP2C9)

Multiskalen Modell der Leber



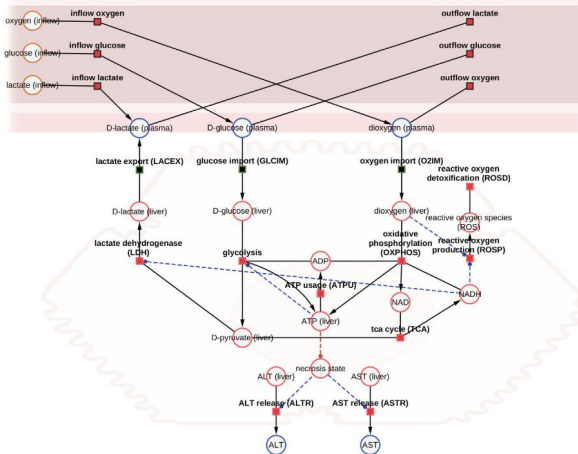
Lebermetabolismus

Medikamentenstoffwechsel

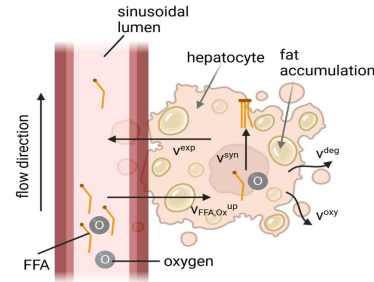


Liver

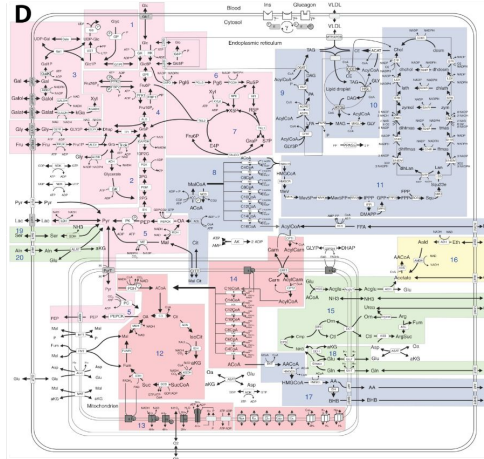
Energiestoffwechsel & Schädigung



Steatose



Zentralstoffwechsel



L. Lambers, N. Waschinsky, J. Schleicher, M. König, HM. Tautenhahn, M. Albadry, U. Dahmen, T. Ricken. *Quantifying fat zonation in liver lobules: an integrated multiscale in silico model combining disturbed microperfusion and fat metabolism via a continuum biomechanical bi-scale, tri-phasic approach.* Biomech Model Mechanobiol. 2024 Feb 25. doi: 10.1007/s10237-023-01797-0.

S. Gerhäuser, L. Lambers, L. Mandl, J. Franquinet, U. Dahmen, T. Ricken, M. König. *Simulation of zonation-function relationships in the liver using coupled multiscale models: Application to drug-induced liver injury.* bioRxiv 2024.03.26.586870; doi:10.1101/2024.03.26.586870

Mareshvare MD., Raha S., König M.Δ, and Pal D.Δ (Δ equal contribution). *A pathway model of glucose-stimulated insulin secretion in the pancreatic β-cell.* Front. Endocrinol. 14:1185656 (publication). doi:10.3389/fendo.2023.1185656

Berndt N., Bulik S., Wallach I., Wünsch T., König M., Stockmann M., Meierhofer M., Holzhütter HG. *HEPATOKIN1: A Biochemistry-Based Model of Liver Metabolism Suited for Applications in Medicine and Pharmacology.* Nat Commun. 2018 Jun 19;9(1):2386. doi:10.1038/s41467-018-04720-9.

Gille C., Bölling C., Hoppe A., Bulik S., Hoffmann S., Hübner K., Karlstädt A., Ganeshan R., König M., Rother K., Weidlich M., Behre J., Holzhütter HG. *HepatoNet1: a comprehensive metabolic reconstruction of the human hepatocyte for the analysis of liver physiology.* Mol Syst Biol. 2010 Sep 7;6:411 doi:10.1038/msb.2010.62.

König M., Holzhütter HG., Berndt N. *Metabolic Gradients as Key Regulators in Zonation of Tumor Energy Metabolism: A Tissue-scale Model Based Study.* Biotechnol J. 2013 Sep;8(9):1058-69. (publication). doi:10.1002/biot.201200393.

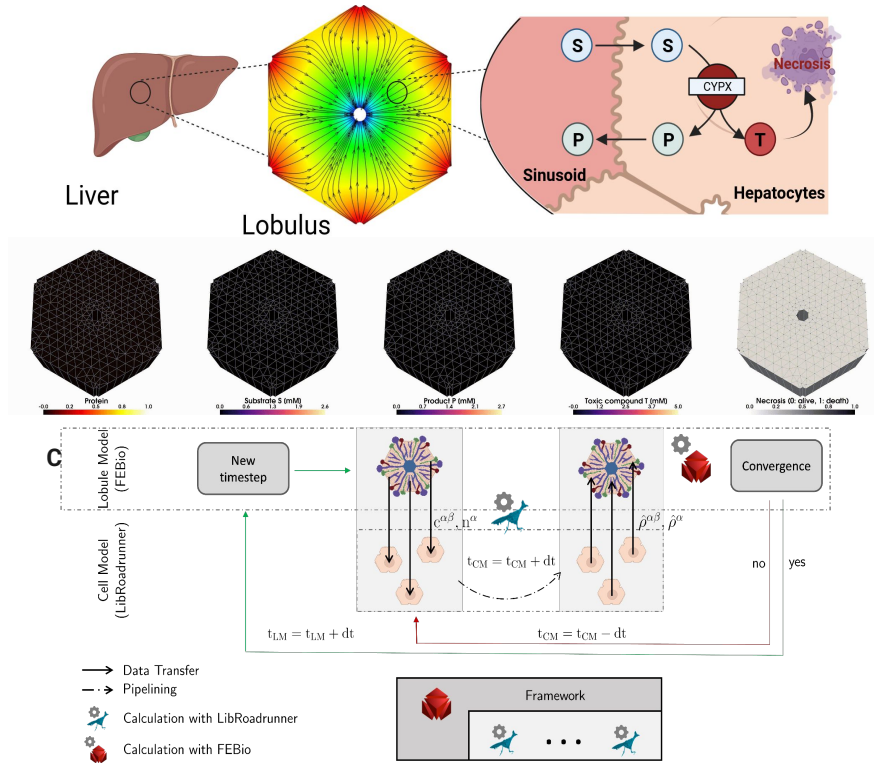
König M. and Holzhütter HG. *Kinetic Modeling of Human Hepatic Glucose Metabolism in T2DM Predicts Higher Risk of Hypoglycemic Events in Rigorous Insulin Therapy* J Biol Chem. 2012 Oct 26;287(44):36978-89. doi:10.1074/jbc.M112.382069.

König M., Bulik S. and Holzhütter HG. *Quantifying the Contribution of the Liver to the Homeostasis of Plasma Glucose: A Detailed Kinetic Model of Hepatic Glucose Metabolism Integrated with the Hormonal Control by Insulin, Glucagon and Epinephrine.* PLoS Comput Biol. 2012 Jun;8(6):e1002577. Epub 2012 Jun 21. doi:10.1371/journal.pcbi.1002577

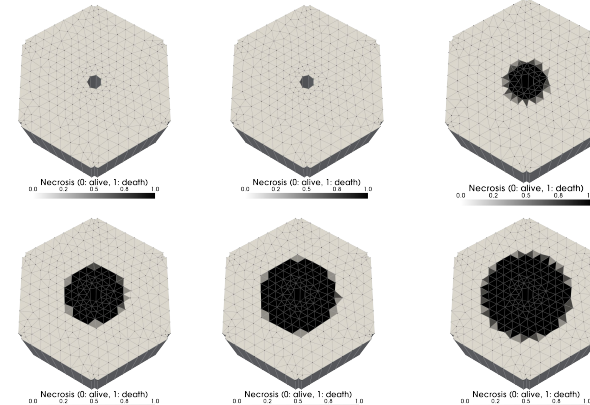
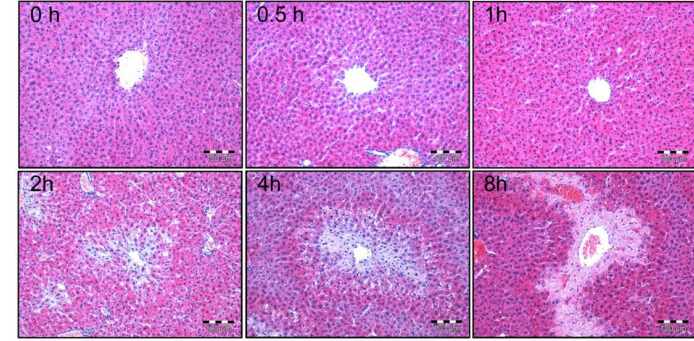
König M., Bulik S., Holzhütter HG. *Enzymatic Features of the Glucose Metabolism in Tumor Cells.* Herling A, FEBS J. 2011 Jul;278(14):2436-59. doi:10.1111/j.1742-4658.2011.08174.x.

Digitaler Zwilling - Lobulus

Cytochrome P450 & Nekrose



Necrosis



Simulation of zonation-function relationships in the liver using coupled multiscale models: Application to drug-induced liver injury. S Gerhäuser, L Lambers, L Mandl, J Franquinet, U Dahmen, T Ricken, M König. bioRxiv 2024.03.26.586870; doi:10.1101/2024.03.26.586870

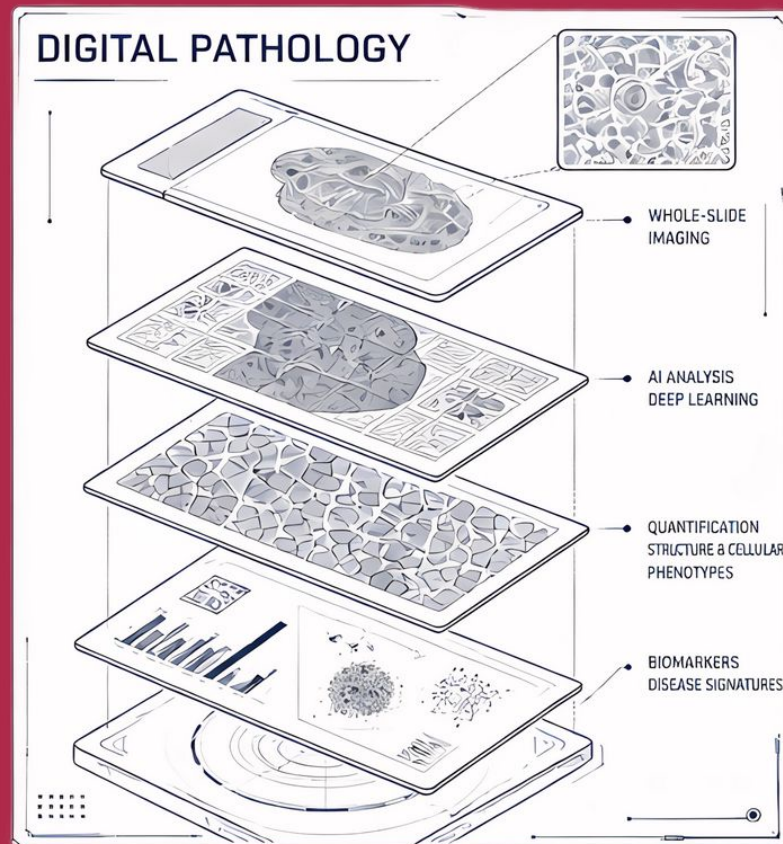
Quantifying fat zonation in liver lobules: an integrated multiscale in silico model combining disturbed microperfusion and fat metabolism via a continuum biomechanical bi-scale, tri-phasic approach. L Lambers, N Waschinsky, J Schleicher, M König, HM Tautenhahn, M Albadry, U Dahmen and TRicken. Biomech Model Mechanobiol. 2024 Feb 25.. doi:10.1007/s10237-023-01797-0.



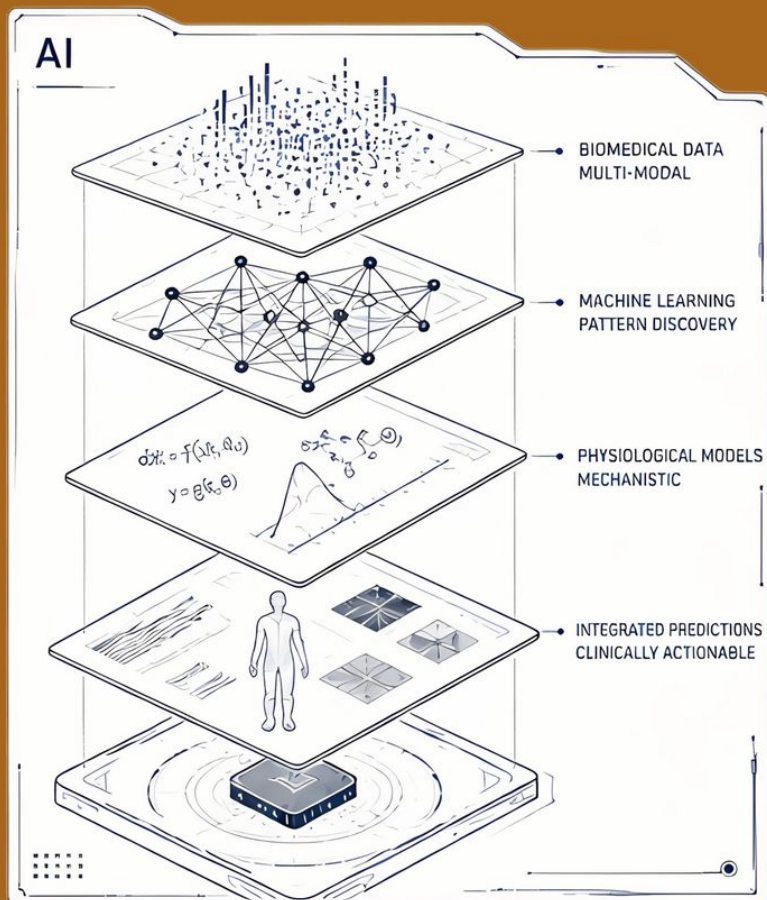
Digital Pathology

AI-driven analysis of whole-slide histology to quantify liver structure and disease at scale.

A biopsy holds a whole organ's story.
We use AI to read whole-slide histology at scale, quantifying liver structure and disease with a precision no eye can match.



AI

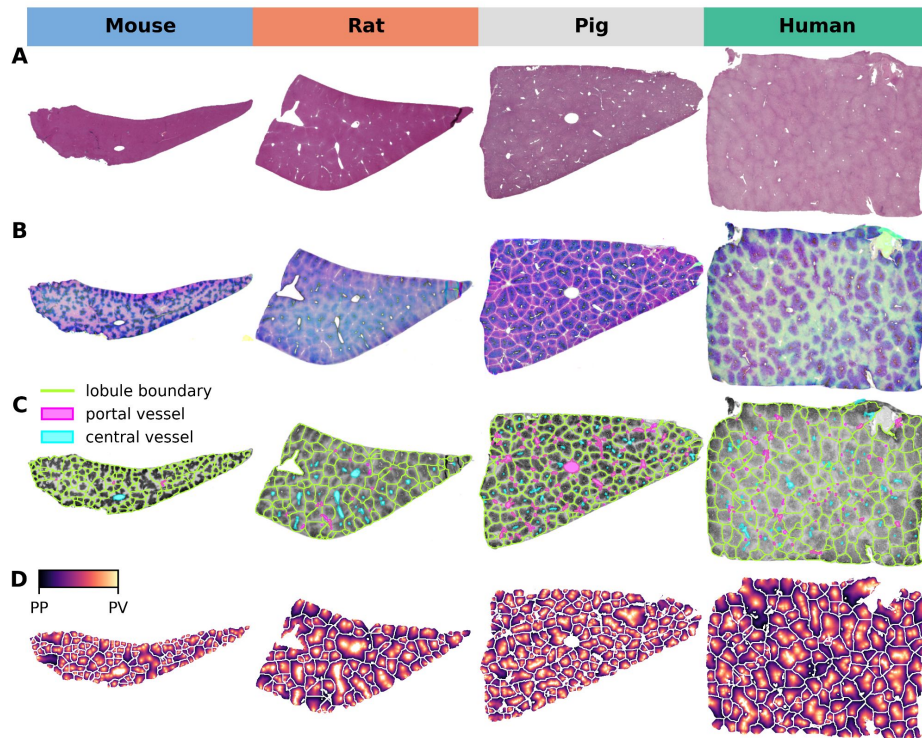


AI

Mechanistic modeling meets machine learning for predictive, personalized medicine.

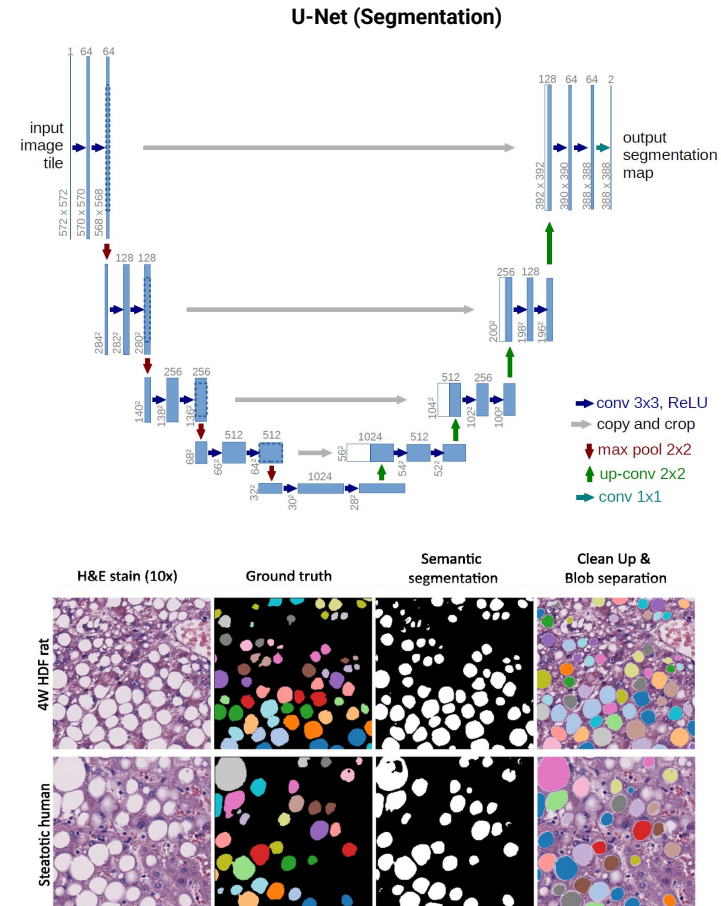
Data alone cannot explain a patient — mechanism can. We fuse machine learning with physiological models to turn complex biomedical data into predictions clinicians can trust.

KI: Geometry & Steatose aus Whole-Slide Scans



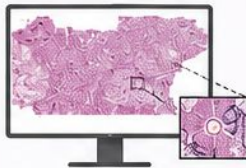
Cross-Species Variability in Lobular Geometry and Cytochrome P450 Hepatic Zonation: Insights into CYP1A2, CYP2E1, CYP2D6 and CYP3A4 Mohamed Albadry, Jonas Kuettner, Jan Grzegorzewski, Olaf Dirsch, Eva Kindler, Robert Klopffleisch, Vaclav Liska, Vladimira Moulisova, Sandra Nickel, Richard Palek, Jachym Rosendorf, Sylvia Saalfeld, Utz Settmacher, Hans-Michael Tautenhahn, **Matthias König***, Uta Dahmen* (* equal contribution). Front Pharmacol. 2024 May 16;15:1404938. doi:[10.3389/fphar.2024.1404938](https://doi.org/10.3389/fphar.2024.1404938)

Quantitative Image Analysis of Hepatic Zonation in Cytochrome P450 and Steatosis Using Whole Slide Scans, Master Thesis J. Küttner (supervisor: **M. König**), August 2024

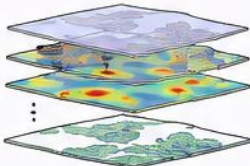


3 DYNAMIC VISUALIZATION

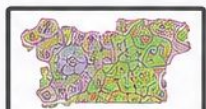
Multi-scale Viewer



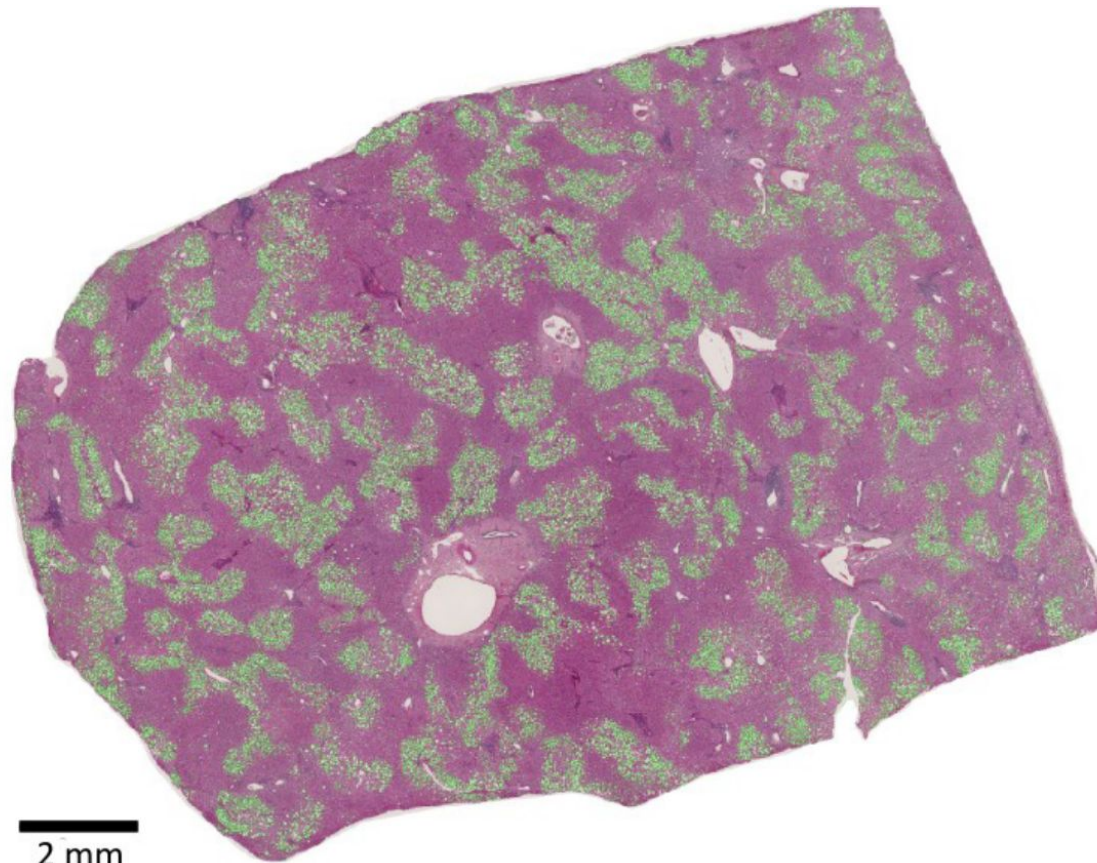
Layered Maps



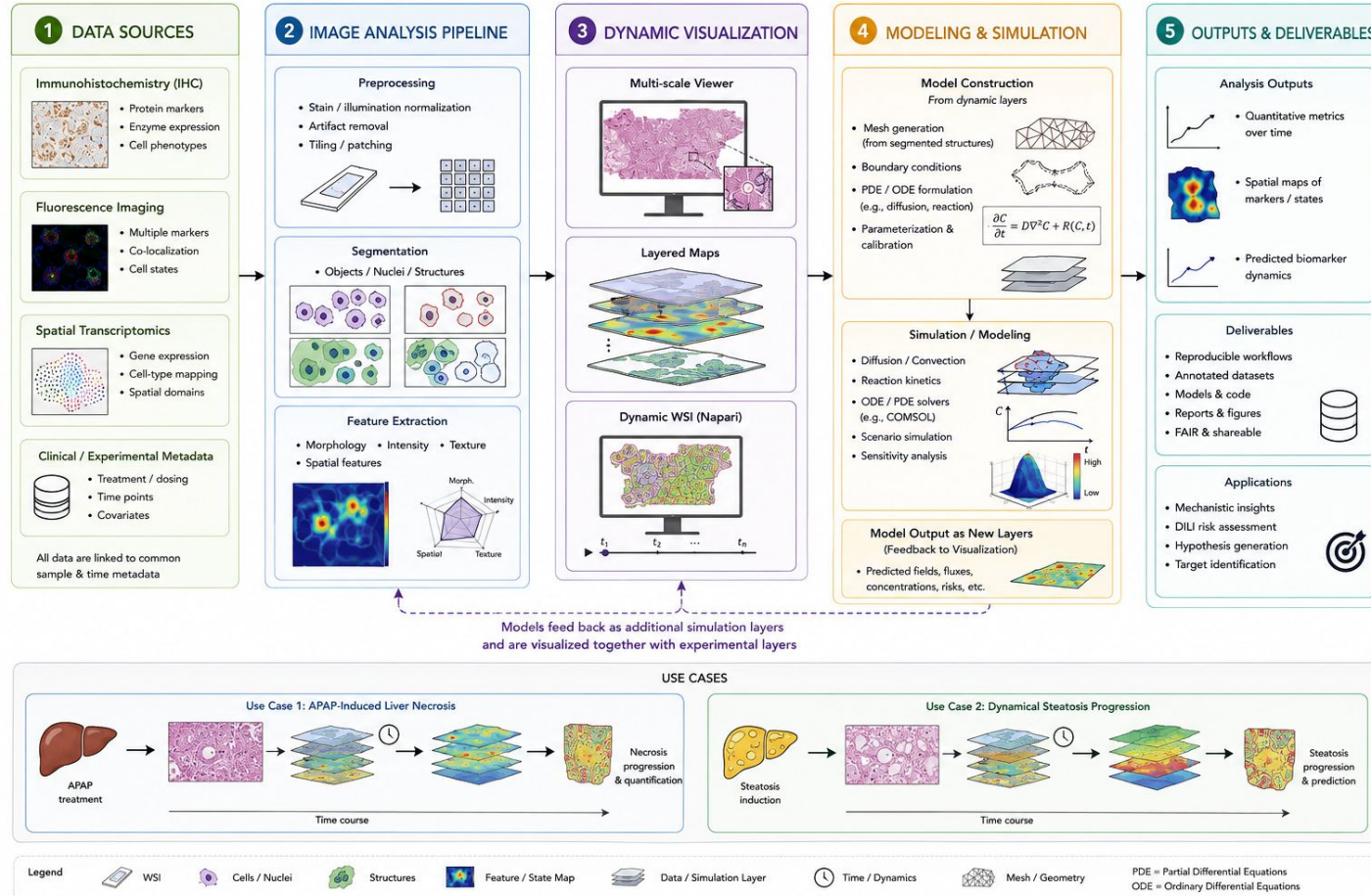
Dynamic WSI (Napari)



t_1 t_2 ... t_n

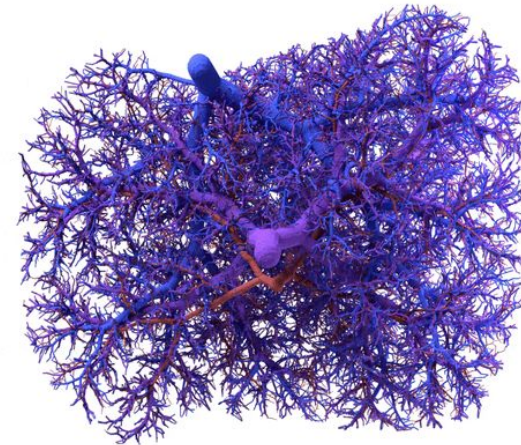
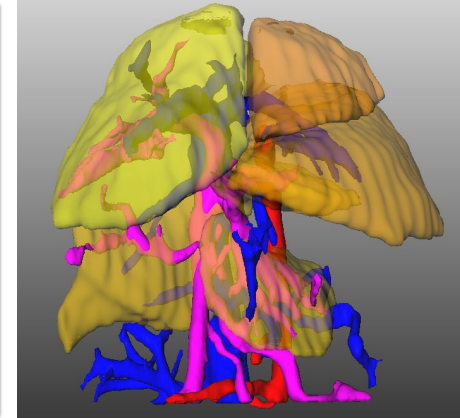
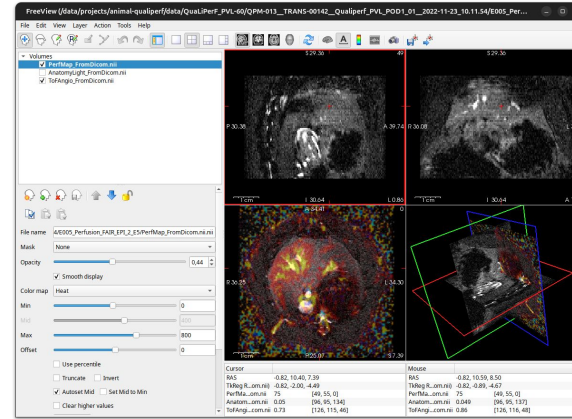


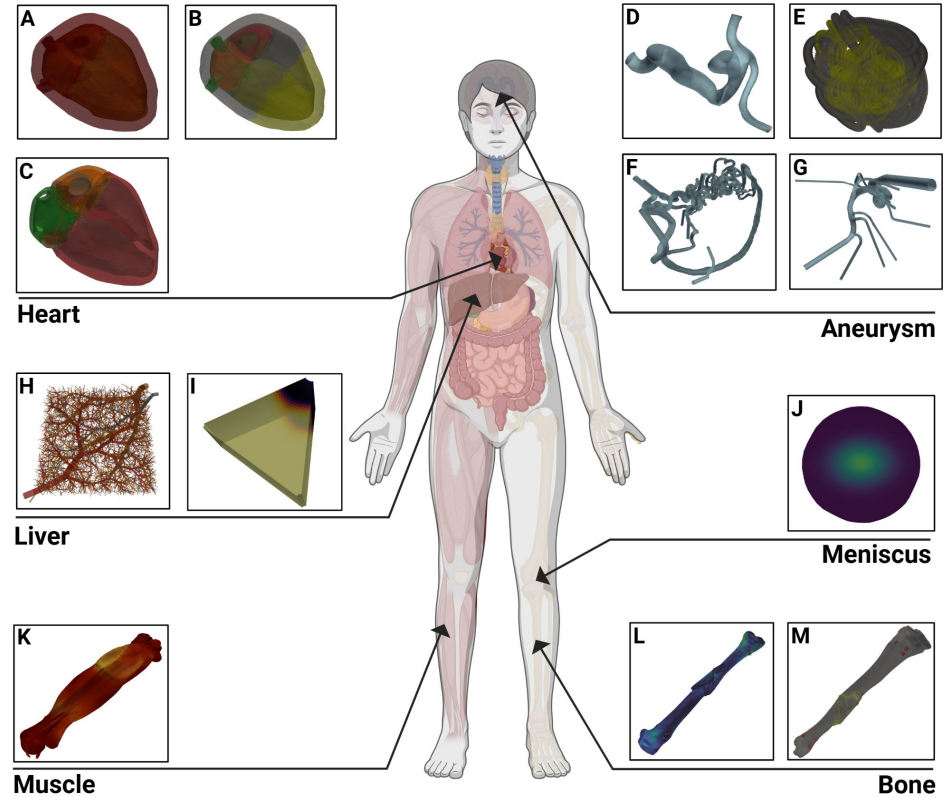
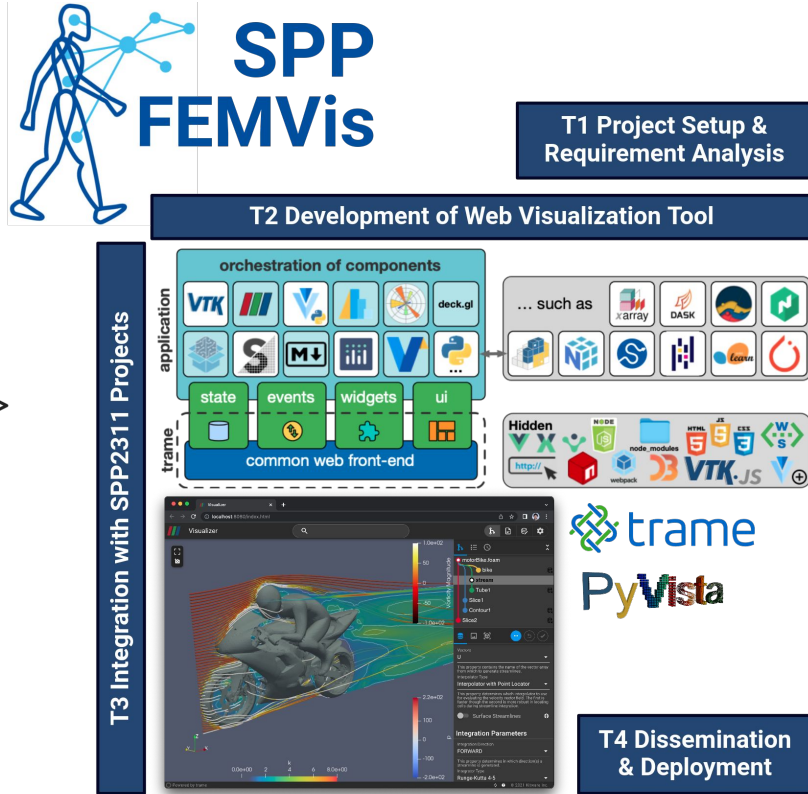
Spatial OMICS & Dynamical Functional Maps



KI: Digitaler Zwilling - Organmodelle

- Effekt von Leber Geometrie und Vaskularisierung auf Perfusion und Funktion
- Rekonstruktion von Leber Geometrie und Gefäßbäumen
 - Perfusion MRI
 - Anatomisches MRI
 - Angiographie
 - Tumor
- Simulation von Perfusion und Metabolismus





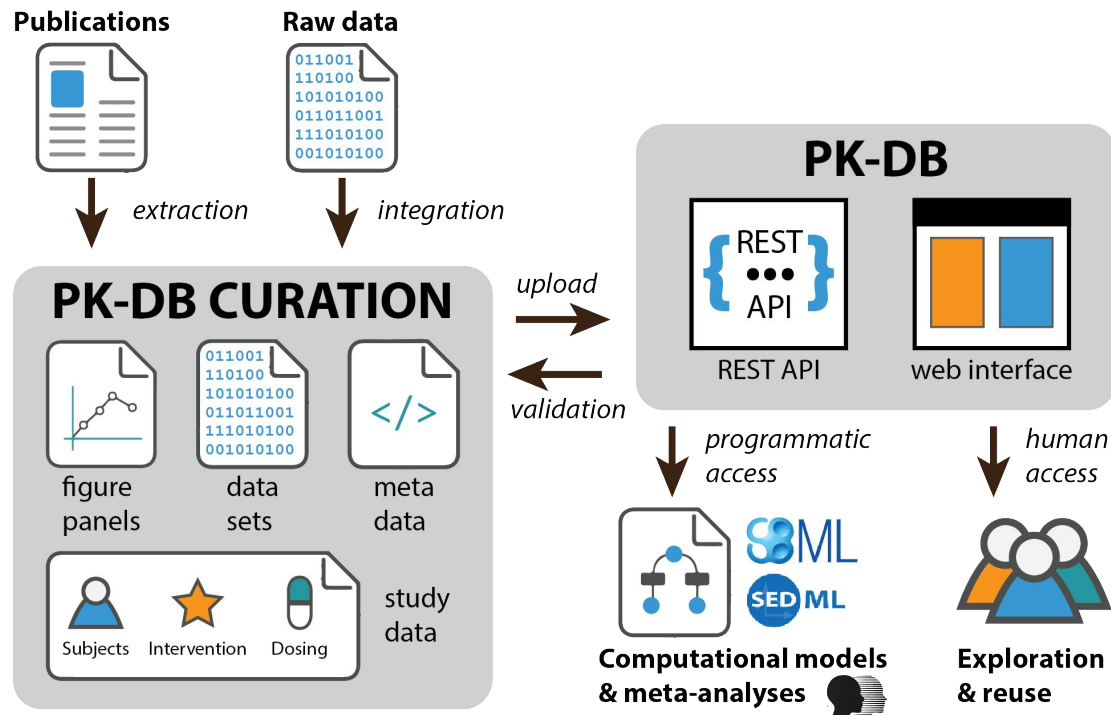


Open & FAIR

Science that cannot be reproduced cannot be trusted. Every model, dataset, and line of code we publish is open, FAIR, and built for the community to verify, reuse, and extend.

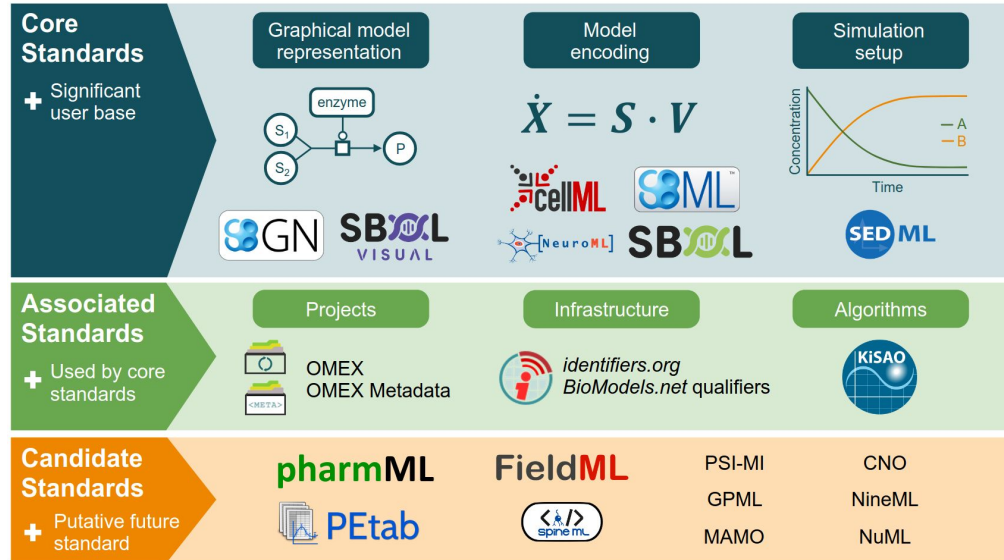


Pharmakokinetik Datenbank (PK-DB)



PK-DB: pharmacokinetics database for individualized and stratified computational modeling. Grzegorzewski J, Brandhorst J, Green K, Eleftheriadou D, Duport Y, Barthorscht F, Köller A, Ke DYJ, De Angelis S, **König M.** Nucleic Acids Res. 2020 Nov 5:gkaa990. doi: [10.1093/nar/gkaa990](https://doi.org/10.1093/nar/gkaa990). <https://pk-db.com>

Entwicklung von Standards



- Modelle (SBML)
- Simulationen (SED-ML)
- Visualisierung (SGBN)
- Parameter Optimierung (PETab)
- Metadaten (OMEX)

Specifications of Standards in Systems and Synthetic Biology: Status and Developments in 2022 and the COMBINE meeting 2022. M. König et al. J Integr Bioinform. 2023 Mar 29;20(1).

SBML Level 3: an extensible format for the exchange and reuse of biological models. SM Keating, D Waltemath, M König, ..., M Hucka, and SBML Community members. Mol Syst Biol. 2020;16(8):e9110. doi:10.15252/msb.20199110

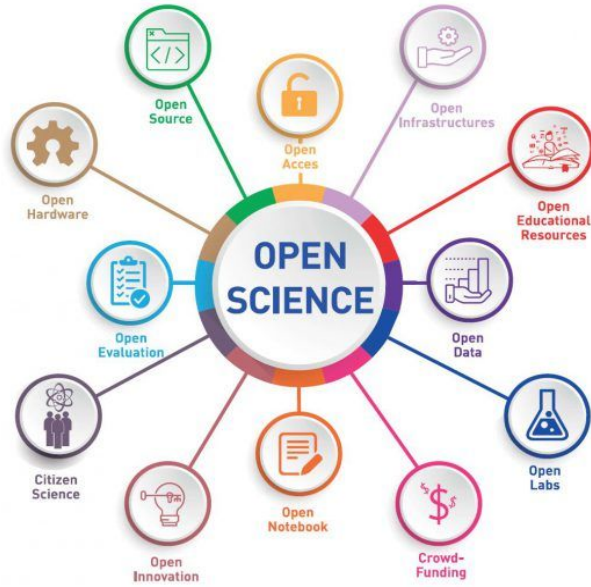
The Systems Biology Markup Language (SBML): Language Specification for Level 3 Version 2 Core. M. Hucka, F. Bergmann, C. Chaouiya, A. Dräger, S. Hoops, S. Keating, M. König, N Le Novère, C. Myers, B. Olivier, S. Sahle, J. Schaff, R. Sheriff, L. Smith, D. Waltemath, D. Wilkinson, F. Zhang. J Integr Bioinform. 2019 Jun 20;16(2); 10.1515/jib-2019-0021

The Distributions Package for SBML Level 3. L. Smith, S. Moodie, F. Bergmann, C. Gillespie, S. Keating, M. König, C. Myers, M. Swat, D. Wilkinson, M. Hucka. J Integr Bioinform. 2020 Aug 4; doi: 10.1515/jib-2020-0018

Open modeling and exchange (OMEX) metadata specification version 1.0. Neal ML, Gennari JH, Waltemath D, Nickerson DP, König M. J Integr Bioinform. 2020 Jun 25;17(2-3):20200020. doi:10.1515/jib-2020-0020.

Harmonizing semantic annotations for computational models in biology. Neal, M.; König, M.; Nickerson, D., ...mWaltemath, D. Brief Bioinform. 2019 Mar 22;20(2):540-550. doi:10.1093/bib/bby087.

Open und FAIR Science



FE Kohrs, ... , **M König**, ..., TL Weissgerber. **Eleven Strategies for Making Reproducible Research and Open Science Training the Norm at Research Institutions.** eLife (2023)

Ten Simple Rules for FAIR Sharing of Experimental and Clinical Data with the Modeling Community. **König M**, Grzegorzewski J, Golebiewski M., Hermjakob H, Hucka M, Olivier B, Keating SM, Nickerson D, Schreiber F, Sheriff R, Waltemath D. Preprints 2021, 2021080303, doi: 10.20944/preprints202108.0303.v2.

FAIR Sharing of Reproducible Models of Epidemic and Pandemic Forecast Ramachandran, K.*; **König, M.***; Scharm, M.; Nguyen, T.V.N.; Hermjakob, H.; Waltemath, D.; Malik Sheriff, R.S. (* equal contribution). Preprints 2022, 2022060137 (doi: 10.20944/preprints202206.0137.v1).

Open Data in Repositories

- BioModels DB, GitHub, Zenodo
- PK-DB

Open/FAIR models

- CC-BY, Zenodo, GitHub, FAIR Indicators

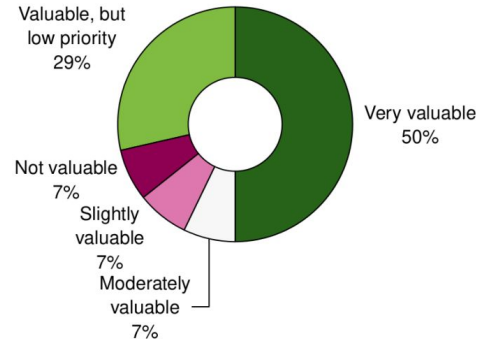
Open Science Initiativen

- Strategieentwicklung (Open Science Training an Universitäten)
- Open Science Botschafter (2024-2025)

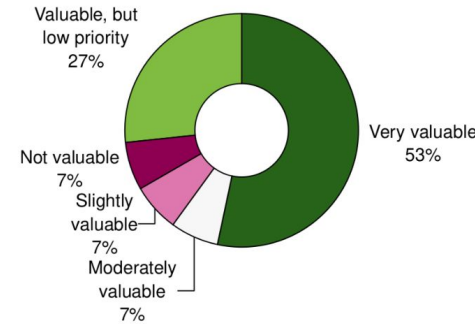


Impact of Digital Twins & AI

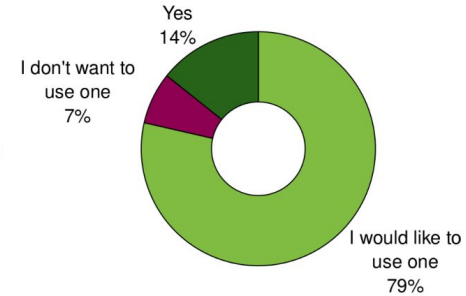
a Value of Digital Twins



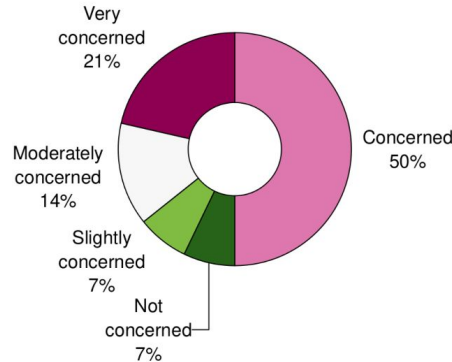
b Value of Artificial Intelligence



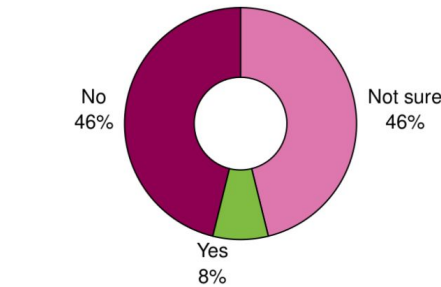
c Usage of CDSS



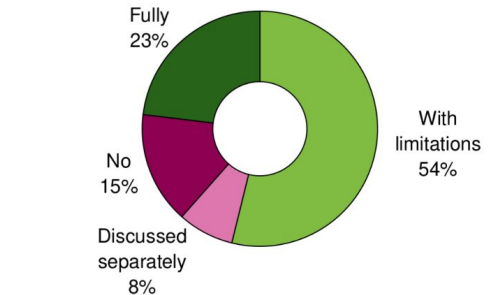
d Automation bias



e Legal protection



f Consideration of patient preferences



Systems Medicine, Digital Twins & AI

Prof. Dr. rer. nat. Matthias König

Professor of Metabolic Inflammation and Carcinogenesis of the Liver



Digital Twins

Physiologically based models that mirror individual patients, from molecule to whole body.



AI

Mechanistic modeling meets machine learning for predictive, personalized medicine.



Digital Pathology

AI-driven analysis of whole-slide histology to quantify liver structure and disease at scale.



Pharmacometrics

Physiologically based pharmacokinetic/ pharmacodynamic models for precision dosing.



Open & FAIR

Reproducible, standardized models and data that the community can build on.



Explore our work

livermetabolism.com



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- **BMBF/excellence initiative: X-Student Research Group** - Physiologically based digital twins for the treatment of hypertension, 2022 & 2023
- **Google Summer of Code**, 2019-2025, student support
- **COMBINE**, travel grants



Bundesministerium
für Bildung
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DFG



Google
Summer of Code

