

Science is fun but not only: career perspectives for young talented researchers in a modern society

Igor V. Tetko

Helmholtz Munich and BIGCHEM GmbH

July 11, 2023, On-line Zoom





Agenda

- Undergraduate
- PhD
 - Marie Skłodowska-Curie program
- Translational studies

Undergraduate

Initial career opportunities

- HiWi (Research Assistant)
- Short research projects
- Erasmus

HiWi (Research Assistant)



H Schoof, P Zaccaria, H Gundlach, K Lemcke, S Rudd, G Kolesov, ... Nucleic Acids Research 30 (1), 91-93

Since 201	All	
442	7531	Citations
2	35	h-index
4	47	i10-index
140		
105	- 1	
70	- 1 B	
35	111	111
2022 2023	2019 2020 2021	2016 2017 2018

HiWi (Research Assistant)



Susann Bader (She/Her) · 1st

Scientific Software Engineer @ Genedata

Bavaria, Germany · Contact info

214 connections



Yurii Sushko, Sergii Novotarsk







TITLE	CITED BY	YEAR
LocTree3 prediction of localization T Goldberg, M Hecht, T Hamp, T Karl, G Yachdav, N Ahmed, U Altermann, Nucleic acids research 42 (W1), W350-W355	285	2014
Modeling the biodegradability of chemical compounds using the online CHEmical modeling environment (OCHEM) S Vorberg, IV Tetko Molecular Informatics 33 (1), 73-85	67	2014
Synthetic protein alignments by CCMgen quantify noise in residue-residue contact prediction S Vorberg, S Seemayer, J Söding PLoS computational biology 14 (11), e1006526	20	2018

Susann Bader (geb Vorberg)





Genedata

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Citations	376	273
n-index	4	4
10-index	3	3
		80
. 11	Ιr.	40
016 2017 201	3 2019 2020 2	021 2022 2023 0

Short Research Projects



Prof. Dr. Katharina Jahn

Freie Universität Berlin

Institut für Informatik Biomedical Data Science Professor

Address

Takustr. 9 Room 009 14195 Berlin

Support vector machines for separation of mixed plant-pathogen EST collections based on codon usage

- Authors Caroline C Friedel, Katharina HV Jahn, Selina Sommer, Stephen Rudd, Hans W Mewes, Igor V Tetko
- Publication date 2005/4/15
 - Journal Bioinformatics
 - Volume 21
 - Issue 8
 - Pages 1383-1388
 - Publisher Oxford University Press
 - Description Motivation: Discovery of host and pathogen genes expressed at the plant-pathogen interface often requires the construction of mixed libraries that contain sequences from both genomes. Sequence identification requires high-throughput and reliable classification of genome origin. When using single-pass CDNA sequences difficulties arise from the short sequence length, the lack of sufficient taxonomically relevant sequence data in public databases and ambiguous sequence homology between plant and pathogen genes.

Results: A novel method is described, which is independent of the availability of homologous genes and relies on subtle differences in codon usage between plant and fungal genes. We used support vector machines (SVMs) to identify the probable origin of sequences. SVMs were compared to several other machine learning techniques and to a probabilistic algorithm (PF ...

Total citations Cited by 36



BSc and MSc projects

OCHEM consensus model wins Kaggle solubility challenge



Ms A. Kopp, BSc student at LMU

Erasmus (*European Community Action Scheme for the Mobility of University Students*)

5600 organisation from world 38 countries

Erasmus Charter for Higher Education

https://erasmus-plus.ec.europa.eu







Erasmus of Rotterdam or **Erasmus (**1466 –1536) was a Dutch philosopher and Catholic theologian who is considered one of the greatest scholars of the Northern_Renaissance.

Source of images: wiki and Erasmus web site



ChEMoinformaticsPlus: the Erasmus Mundus Master degree in Chemoinformatics across Europe and beyond

7 universities are involved in the two years *Erasmus Mundus Joint Master's Degree ChEMoinformaticsPlus* that will open to its first student's edition in **September 2022**. The Erasmus Mundus label is awarded by the European commission to transnational Master programs that contribute to excellence and internalization of Higher Education in Europe.

Chemoinformatics is a major discipline in theoretical chemistry, using artificial intelligence and data sciences to tackle current social and innovation challenges in Chemistry. It concerns the development, creation, organization, storage, dissemination, analysis, visualization and use of chemical information. Within the last 20 years, Chemoinformatics has become a corner stone for the chemical Industry:

"The use of artificial intelligence/ machine learning technologies has become a critical part in the drug discovery processes and chemoinformatics plays an important role in integrating AI/ML approaches into the field of medical chemistry." (Astellas Pharma Inc.),

PhD

PhD position announcements (external)

- <u>https://euraxess.ec.europa.eu</u>
- LinkedIn groups, e.g.
 - Jobs in computational chemistry, computational drug design, cheminformatics & molecular modelling
 - Master Chemoinformatics (MSc)
- <u>http://ccl.net/chemistry/announcements/jobs/</u>
- <u>https://www.dfg.de/en/research_funding</u>
- Nature, Science job announcements
- ResearchGate, Twitter
- Mailing lists, e.g., <u>connectionists@cs.cmu.edu</u>

Marie Skłodowska-Curie Actions

2021-2027

Developing talents, advancing research



Under Pillar I of Horizon Europe, the MSCA are the European Union's reference programme for doctoral education and postdoctoral training. They support researchers from all over the world, at all stages of their careers, with a focus on their training, skills and career development.

Under Horizon 2020 (2014-2020), the MSCA:

Funded **1080 doctoral** programmes, of which 156 industrial doctoral programmes and 76 joint doctorates

Involved 4 700 companies, of which 2 200 SMEs

Involved **37% of** researchers from non-EU countries and around **1300** organisations from non-EU and non-associated countries

Since 1996 budget 14 billion € researchers 140 000 (39 000 PhDs) Horizon Europe (2021-2027) budget 6.6 billion € researchers 65 000

65 000 (25 000 PhDs)

Under Horizon Europe, the MSCA will:

Strengthen organisations

The MSCA support excellent doctoral and postdoctoral programmes and collaborative projects worldwide, promoting structuring impact on organisations

Foster research and innovation beyond academia

The MSCA boost ties between academia and other non-academic organisations with various incentives, increasing fellows' exposure to other sectors

Build international links

The MSCA are key in attracting talent to Europe, building international, strategic partnerships, and promoting global research mobility and science cooperation

The MSCA have main actions

Doctoral Networks

implement doctoral

programmes (including joint doctorates and industrial doctorates) by international partnerships of organisations from different sectors. They train highly-skilled doctoral candidates, stimulate their creativity, enhance their innovation capacities and boost their employability in the long-term.

Fellowships support researchers' careers and foster excellence

Postdoctoral

in research and innovation. Researchers holding a PhD can carry out their research activities, acquire new skills and develop their careers abroad, whilst developing competences in non-academic sectors and working within interdisciplinary teams.

Staff Exchanges

encourage short-term international and intersectoral exchanges of research and innovation staff through sustainable, collaborative projects

in Europe and beyond. By doing so, they enhance knowledge and skills transfer and increase organisations' research and innovation capacities.

COFUND

co-finances regional, national and international doctoral and postdoctoral programmes for researchers' training and career development. The COFUND action spreads MSCA's best practices by setting high standards and excellent working conditions, and boosts training and international, interdisciplinary and inter-sectoral mobility.

MSCA and Citizens

brings research and researchers closer to children, families and the public at large through the European Researchers' Night - the annual research communication and promotion event taking place at the end of September across EU Member States and Horizon Europe Associated Countries.

Benefits of MSCA:

for researchers

for organisations

- High-quality research training and supervision offered
- Build up strong research and innovation partnerships
- Strengthened research capacity
- Improved human resources and working conditions to attract the best researchers
- Sustainable knowledge transfer and new international and intersectoral collaborations
- Enhanced global visibility and attractiveness

- New knowledge and skills in and outside academia
- Increased career prospects and employability
- Innovation-oriented mindset, to convert ideas into products and services
- Networking and increased visibility in the European R&I community
- International, interdisciplinary and inter-sectoral experience and exposure
- Access to leading organisations and their teams

Scientific excellence promoted

for European Research and

Innovation

in all countries

- Attract and retain talents in Europe
- High quality R&I for Europe's sustainable growth
- Increased strategic cooperation and brain circulation between countries, disciplines and sectors
- New links between research, industry and society
- Stronger European Research Area (ERA)

O

Nobel price to former MSCA fellow

On 7 October 2020, the Royal Swedish Academy of Science awarded the <u>Nobel Prize in</u> <u>Chemistry</u> to Emmanuelle Charpentier and Jennifer A. Doudna 'for the development of a method for genome editing'.

Dr Charpentier is a former MSCA fellow and principal investigator involved in the training of young researchers in the field of genomics in the MSCA project <u>ENLIGHT-TEN ITN</u>.

MSCA ITN applications

- Strong scientific competitive program, success rate ca 10%
- Evaluation is done of the whole consortium not of the individual partner
- Complementarity of partners
- Strong training program ("Curriculum")
- Strong training in complementarity skills





19th successful PhD in ECO network

On December 9 2015, <u>Dr. Alessandra Pirovano</u> successfully defended her PhD thesis at the Radboud University. Dr. Prirovano was ECO fellow at the same University. The topic of her thesis is <u>"Quantifying biotransformation of xenobiotics</u> in mammals" under supervisor of Prof. dr. ir. A.J. Hendriks.



<u>R</u>egistration, <u>Evaluation</u>, <u>Authorisation and</u> Restriction of <u>Ch</u>emical substances

Registration, Evaluation, Authorisation and restriction of CHemicals

<u>European</u> <u>Chemicals</u> <u>Agency</u> (ECHA) in Helsinki



What is the REACH Timetable?



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Added Value through Sustainability

D • BASF

http://www.basf.com/group/corporate/en/sustainability/management-and-instruments/success-added-value

Origin of the fellows





Origin of fellows per country



ECO http://ecoitn.eu Environmental ChemOinformatics PUBLICATIONS REACH FELLOWS SCHOOLS CONTACT **NEWS** ECO News SITE STRUCTURE ECO News and Events ¥ ECO ✓ Description General information · Synergism 31 PhDs were awarded to the former ECO fellows. See the impact of ECO ITN Methodology publications at Google Scholar. Dissemination Abbreviations Training > Partners 10 doctoral (PhD) positions in Big Data Analysis in Chemistry, Marie Skodowska-BigChem > Projects involved Curie ITN BIGCHEM (http://bigchem.eu) News BIGCHEM (BIG data in CHEMistry) is a Marie Skodowska-Curie Innovative Training Network (ITN) for Early Stage Researchers (ESR) funded by the European Commission under the H2020 Programme. The BIGCHEM ITN will provide · Archive a comprehensive and cross-disciplinary structured curriculum for doctoral students in large chemical data analysis using REACH machine-learning, computational chemistry and chemoinformatics methods. The innovative research program will be · Fellows implemented with the target users, large pharma companies and SMEs, which generate and analyse large chemical data. Schools Final Conference 2013 Winter School 2013 Summer School 2012

- Winter School 2012
- Autumn School 2011
- Winter School 2011
- Autumn School 2010
- Publications
- > Contact

slas ECO publication received 2016 SLAS ReadersChoice Awards

On January 26 2016, SLAS announced that article of Schorpp, K. et al Identification of Small-Molecule Frequent Hitters from AlphaScreen High-Throughput Screens J. Biomol. Screen. 2014. 19 715-726 received 2016 JBS Readers Choice Award. ECO fellow Mrs. Elena Salmina contributed to the chemoinformatics analysis of this study during her short-term fellowship in HMGU, group of Dr. Tetko.

Tuesday, 26 January 2016



19th successful PhD in ECO network

On December 9 2015, <u>Dr. Alessandra Pirovano</u> successfully defended her PhD thesis at the Radboud University. Dr. Prirovano was ECO fellow at the same University. The topic of her thesis is <u>"Quantifying biotransformation of xenobiotics</u> in mammals" under supervisor of Prof. dr. ir. A.J. Hendriks.

The final School of the ECO project (September 2013)



	ECO ITN publications Environmental ChemOinformatic - FP7 Marie Curie Innovative Training Networ		Follow	GET	MY OWN PROFILE
Ceco	Verified email at ecoitn.eu REACH chemoinformatics Ecotoxicology Nanotoxicology QSAR			Cited by	
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TITLE		CITED BY	YEAR	Citations h-index	4686 34
development and p I Sushko, S Novotarsky	odeling environment (OCHEM): web platform for data storage, model oublishing of chemical information yi, R Körner, AK Pandey, M Rupp, W Teetz, ded molecular design 25, 533-554	527	2011	i10-index	58
	erent approaches to define the applicability domain of QSAR models ri, D Ballabio, A Mauri, V Consonni, R Todeschini -4810	418	2012		Ш
chemicals to marin	SJ Rowland, AJ Hendriks, RC Thompson	402	2016	2016 2017 2018 2	019 2020 2021 2022
human hepatocellu	cytotoxicity of graphene oxide and carboxyl graphene nanoplatelets in the ular carcinoma cell line Hep G2 x, ML Fernández-Cruz, JM Navas plogy 10, 1-21	377	2013	Co-authors	
K Mansouri, T Ringstee	ure–activity relationship models for ready biodegradability of chemicals d, D Ballabio, R Todeschini, V Consonni ormation and modeling 53 (4), 867-878	237	2013	Roberto	M GmbH & Helmholt Todeschini
adverse reactions I Sushko, E Salmina, V	erver of structural alerts for toxic chemicals and compounds with potential A Potemkin, G Poda, IV Tetko ormation and modeling 52 (8), 2310-2316	217	2012	Peijnenbo RIVM - C	enter for Safety of S
Degree of deacety IKD Dimzon, TP Knepp	lation of chitosan by infrared spectroscopy and partial least squares	137	2015	Faizan S	r of Environmental S

Examples of careers



Kamel Mansouri [orcid:0000-0002-6426-8036] Computational Chemist at NIH/NIEHS/DTT/NICEATM Verified email at nih.gov - Homepage

QSAR cheminformatics computational chemistry computational toxicology

	Y	
TITLE	CITED BY	YEAR
The CompTox Chemistry Dashboard: a community data resource for environmental chemistry AJ Williams, CM Grulke, J Edwards, AD McEachran, K Mansouri, Journal of cheminformatics 9, 1-27	624	2017
ToxCast chemical landscape: paving the road to 21st century toxicology AM Richard, RS Judson, KA Houck, CM Grulke, P Volarath, Chemical research in toxicology 29 (8), 1225-1251	495	2016
Comparison of different approaches to define the applicability domain of QSAR models F Sahigara, K Mansouri, D Ballabio, A Mauri, V Consonni, R Todeschini Molecules 17 (5), 4791-4810	418	2012
OPERA models for predicting physicochemical properties and environmental fate endpoints K Mansouri, CM Grulke, RS Judson, AJ Williams Journal of cheminformatics 10 (1), 1-19	294	2018
CERAPP: collaborative estrogen receptor activity prediction project K Mansouri, A Abdelaziz, A Rybacka, A Roncaglioni, A Tropsha, A Varnek, Environmental health perspectives 124 (7), 1023-1033	277	2016
Integrated Model of Chemical Perturbations of a Biological Pathway Using 18 <i>In Vitro</i> High- Throughput Screening Assays for the Estrogen Receptor	262	2015

RS Judson, FM Magpantay, V Chickarmane, C Haskell, N Tania, J Taylor, ... Toxicological Sciences 148 (1), 137-154

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	450
	225
019 2020 2021 2	2022 2022 0
	4163 26 42

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Based on funding mandates



Christian Eschauzier · 1st

Global Director Environment at AkzoNobel

Netherlands · Contact info

500+ connections



Ian Ken Dimzon, Inge van Driezum, and 4 other mutual connections



More





University of Amsterdam



Faizan Sahigara · 1st

Business Development & Brand Manager | QSAR Modeling Expert

Paris, Île-de-France, France · Contact info

1,418 followers · 500+ connections



Joachim Vogt, Dr. Ahmed Sayed, MBA, and 149 other mutual connections



More



King's College London, U. of London



Training activities of ECO: steps to success in career

Advanced training by summer and winter schools

Training in professional skills

Training in complementary skills

Training by participation to international conferences and courses Training in host laboratories according to the individual plans

Online training in QSAR/QSPR tools

Training by internships in industry

Training by secondments with partners

Accelerated Early staGe drug dlScovery



EC HORIZON 2020 Marie Skłodowska-Curie Innovative Training Network (ITN)

Coordination: Michael Sattler, Helmholtz Zentrum München

UNOVARTIS









Target: Trypanosomatids caused by Kinetoplastida

Human Diseases

Disease	Parasite	Epidemilogy	Region
African sleeping sickness	Trypanosoma brucei	7216 Confirmed cases (2012) 20 000 estimated total 70 million in endangered area	Equatorial Africa. "Tse-tse zone"
Chagas disease	Trypanosoma Cruzi	41 000 New cases (2010) 10 000 Deaths	USA, Canada Latin America, Spain,
Leischmaniasis	Leishmania Donovani	1.5-2 million cases yearly,52 000 deaths350 million in endangered area	88 (sub)tropical countries, mainly India but also Southern America and Texas



Animal Diseases

Disease	Parasite	Animals	Region
Nagana	T. Congolese T. Vivax	Cattle, sheep, pigs, horses, camels, monkeys	37 African countries
Dourine (Covering sickness)	T. Equiperdum	Horses, donkeys, mules -untreatable-	Africa, Asiatic Russia, Middle East Europe (2011 Outbreak in Italy)
Surra	T. Evansi T. Suis	Horses, donkeys, mules, cattle, camels,	South America, Africa, Middle East, Philippines
Sheep Ked	T. Melophagium	Sheep (benign)	Northern UK, Croatia (86%), Turkey (8%)
	T. Irwini	Koalas	Australia



Source: WHO Fact sheet N°259 FAO- PAAT Hotez. PJ. Et al PLoS Negl Trop Dis. 7(10): e2300.

Hypothesized Target



PPI interface



Neufeld, C. ... Sattler, M. (2009) EMBO J. 28: 745-754

Peroxins Pex14/Pex5 are responsible for transport of glycosomal enzymes from cytoplasm to glycosomes for glucose metabolism

Hit identification



Dawidowski, M., ... Popowicz, G. M. Science 2017, 355, 1416-1420.



big data in chemistry + informatics = chemoinformatics

The increasing volume of biomedical data in chemistry and life sciences requires development of new methods and approaches for their analysis.

The BIGCHEM project will provide innovative education in large chemical data analysis. The innovative research program will be implemented with the target users, large pharma companies and SMEs, which generate and analyze large chemical data as well as will promote technology transfer from academy to industrial applications.



Marie Skłodowska-Curie Innovative Training Network European Industrial Doctorate
	BIGCHEM publications		FOLLOW	GET MY C	WN PROFILE	
BigChem	Horizon2020 Marie Skłodowska-Curie Innovative Training Network Europear Doctorate Verified email at bigchem.eu big data chemoinformatics cheminformatics	n Industrial		Cited by		
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TITLE		CITED BY	YEAR	Citations h-index	7086 33	7022 32
	earning in drug discovery / Wang, M Olivecrona, T Blaschke 23 (6), 1241-1250	1324	2018	i10-index	55	2200
	o design through deep reinforcement learning thke, O Engkvist, H Chen hatics 9 (1), 1-14	836	2017			165
Automating drug of Schneider lature reviews drug d	discovery liscovery 17 (2), 97-113	519	2018	- 1		55
	r ders h, RP Sheridan, IV Tetko, D Filimonov, V Poroikov, riews 49 (11), 3525-3564	440	2020	2017 2018 2019 2	2020 2021 2022 20	023
	nerative Autoencoder in <i>De Novo</i> Molecular Design ona, O Engkvist, J Bajorath, H Chen 37 (1-2), 1700123	357	2018	Co-authors Ola Engkvist	V	VIEW AL
	entations in Al-driven drug discovery: a review and practical guide Mercado, O Engkvist natics 12 (1), 1-22	236	2020			o
etwork	Ilar generation method using latent vector based generative adversarial	216	2019	Jürgen Bajora Professor of Li	th ife Science Inform	n
ournal of Cheminforn				Thomas Blasc	hke AstraZeneca/Unive	

BIGCHEM fellows: three years after the project end





Two fellows who joined BICGHEM later

Dr. Raquel Rodríguez-Pérez, University of Bonn/Boehringer Ingelheim - PhD by University of Bonn - now **Principal Scientist at** <u>Novartis</u>, Basel, Switzerland

Dr. Arkadii Lin, University of Strasbourg/Boehringer Ingelheim - PhD by University of Strasbourg -now **Team Leader in Chemoinformatics** at <u>Insilico Medicine</u>, Abu Dhabi

Dr. Dipan Ghosh, Helmholtz Zentrum München/LDC - PhD by Technical University of München - now **Scientist at <u>Lead Discovery Center</u>** <u>GmbH</u>, Dortmund, Germany

Laurianne David, University of Bonn/AstraZeneca - now **Computational Chemist at** <u>Evotec</u>, Toulouse, France

Dr. Josep Arús-Pous, University of Bern/AstraZeneca - PhD by University of Berm - now Senior Machine Learning Engineer at Roche, Basel, Switzerland

Dr. Xuejin Zhang, ETH Zürich/Boehringer Ingelheim - PhD by ETH Hönggerberg -now **ML/AI Scientist** at <u>VantAI</u>, USA

Thomas Blaschke, AstraZeneca/University of Bonn (finishing PhD, working on a start-up in the UK)

Dr. Amol Thakkar, University of Bern/AstraZeneca - PhD by University of Berm - now Research Scientist at <u>IBM Research</u>, Zurich,

Michael Withnall, Helmholtz Zentrum München/AstraZeneca - now Head of Computational Chemistry at <u>Apheris AI</u>, Berlin

Oliver Laufkötter, AstraZeneca/University of Bonn (finishing PhD)

Benedict Mutimba,* Boehringer Ingelheim - now Technical Project Manager & Scrum Master at <u>Klick Health</u>, Toronto, Canada

Eric March Vila,* University of Modena and Reggio Emilia, now - Research Associate at Universitat Pompeu Fabra, Barcelona

AIDD ITN https://ai-dd.eu



https://twitter.com/AiddOne

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School at AstraZeneca





Home

Presentations with fellows at conferences, workshops and meetings

2023

All fellows also presented their posters during the AIDD School in AALTO (March 21, Espoo/Helsinki, Finland)

- Presentation of OCHEM model from Kaggle 1st EUOS/SLAS Joint Challenge: Compound Solubility Challenge at during HMGU MTCC workshop (July 7th, 2023)
- Torren-Peraire, P. Enhancing Chemical Synthesis Planning through Combining Single-Step and Multi-Step Retrosynthesis Prediction Strategies. STB seminar (departmental seminar). (May 26th, 2023).
- Mikhail Andronov gave a talk about reagent prediction at the DigiDrug seminar in Berlin organized by Prof. Andreas Bender (May 24th, 2023).
- Invited lecture to present winning model of the Kaggle 1st EUOS/SLAS Joint Challenge: Compound Solubility Challenge at SLAS 2023 conference in Brussels (Peter Hartog is a team member)
- Torren-Peraire, P. AI in the Lab: How Machine Learning Can Transform Chemical Synthesis. Pint of Science Munich. (May 22nd, 2023).
- Ha, S.V. FSL-CP: Few-shot Prediction of small molecule activity using cell microscopy images. AIDD on-line seminar (May 17th, 2023)
- Masood, A., Heinonen, M., Herman, D., Ceulemans, H. Kaski, S. Dos-Time dependent DILI modeling. In Janssen Discovery Data Science meeting. (May 8th, 2023).
- Nahal, Y. Heinonen, M., Engkvist, O. Kaski, S. Human-in-the-loop active learning to improve molecular design and optimization. In AstraZeneca Molecular Design meetings. (April 13th, 2023).
- Torren-Peraire P. Mind the Retrosynthesis Gap: Bridging the divide between Single-step and Multi-step Retrosynthesis Prediction. AIDD on-line seminar (April 5th, 2023)
- Hartog, P., Genheden, S., Tetko, I. Two sides of the same coin: The effect of smiles-based molecular representations on explainability. < Interact> Conference (March 31, 2023)
- Hassen AK., Torren-Peraire P., Genheden S., Verhoeven J, Preuss M., Tetko I. Mind the Retrosynthesis Gap: Bridging the divide between Single-step and Multi-step Retrosynthesis Prediction. <a href="https://www.englightedivide-step-and-willing-
- Fallani, A. Extending 3D generative modeling of molecules with quantum-mechanical properties. AIDD on-line seminar (March 8, 2023)
- Cremer, J. Equivariant Graph Neural Networks for Toxicity Prediction. AIDD on-line seminar (February 1st, 2023)
- · Andronov, M. Reagent prediction with a transformer and its benefits for reaction product prediction. AIDD on-line seminar (February 1st, 2023)

2022

All fellows also presented their posters during the AIDD School in KUL (October 20, Leuven, Belgium)

- Palmacci V. Drug Discovery and Cheminformatics: discovering new drugs in the Big Data era. Seminar at University of Boogna. December 02, 2022.
- Hassen AK., Torren-Peraire P., Genheden S., Verhoeven J, Preuss M., Tetko I. Mind the Retrosynthesis Gap: Bridging the divide between Single-step and Multi-step Retrosynthesis Prediction. NeurIPS 2022 workshop AI for Science: Progress and Promises. December 2, 2022.
- Svensson, E., Hoedt, P.-J., Hochreiter, S., Klambauer, G. Robust task-specific adaption of models for drug-target interaction prediction. In NeurIPS2022 AI4Science Workshop. November 28, 2022.
- Svensson, E., Hoedt, P.-J., Hochreiter, S., Klambauer, G. Task-conditioned modeling of drug-target interactions. In ELLIS Machine Learning for Molecules Discovery Workshop. November 28, 2022.
- Svensson, E., Hoedt, P.-J., Hochreiter, S., Klambauer, G. Task-conditioned modeling of drug-target interactions. In NeurIPS2022 Women in Machine Learning Workshop. November 28, 2022.
- Sanchez-Fernandez, A.; Rumetshofer, E.; Hochreiter, S.; Klambauer, G. Cross-modal Contrastive Learning of Microscopy Image- and Srtructure-Based Representations of Molecules. In NeurIPS2022 Women in Machine Learning Workshop. November 28, 2022.
- Ha, S.V., Tandon A., Czodrowski, P. Overview of Czodrowski Lab AK-Symposium. Johannes Gutenberg University Mainz. November 10th, 2022.
- Masood, A., Heinonen, M., Herman, D., Ceulemans, H. Kaski, S. Dos-Time dependent DILI modeling. In STB, Helmholtz Zentrum München. November 08, 2022.
- Ha, S.V. Few-shot bioassay prediction with Cell Painting for drug discovery. RdKit UGM 2022. October 13th, 2022.
- Sanchez-Fernandez, A. Cross-Modal Contrastive Learning of Microscopy Image and Structure-Based Representations of Molecules. CytoData Symposium. October 10, 2022.
- Masood, A., Heinonen, M., Herman, D., Ceulemans, H. Kaski, S. Dos-Time dependent DILI modeling. In Finnish Center of Artificial Intelligence Virtual Drug Design Lab seminars. October 10, 2022.
- Andronov, M.; Voinarovska, V.; Wand, M.; Schmidhuber, J. Reagent Prediction With a Molecular Transformer Improves Reaction Data Quality. 23rd EuroQSAR, Heidelberg, Germany, September 2022
- Voinarovska, V.; Dudenko, D.; Torren-Peraire, P.; Tetko, I.; Genheden, S. Addressing the applicability domain in yield prediction, 23rd EuroQSAR, Heidelberg, September 26-30, Germany 2022,
- Nahal, Y. Heinonen, M., Engkvist, O. Kaski, S. Human-in-the-loop active learning to improve molecular design and optimization. In Finnish Center of Artificial Intelligence Virtual Drug Design Lab seminars. September 6, 2022.
- Friesacher H.R., Lewis Mervin L., Engkvist O., Moreau Y., Arany A. Can we trust probabilities in deep drug activity models? A comparative calibration study. 21st European Conference on Computational Biology. September 15, 2022.
- Sanchez-Fernandez, A., Rumetshofer, E., Hochreiter, S., and Klambauer, G. Contrastive learning of image-and structure-based representations in drug discovery. In ICML2022 Workshop on Women in Machine Learning. July 18th, 2022
- Radaeva, M. "Novel CADD-designed Lin28B Inhibitors Suppress Stemness in Neuroendocrine Prostate Cancer" in Strasbourg Chemoinformatics Conference, July 1st, 2022
- Fallani, A., Medrano Sandonas, L. and Tkatchenko, A. Towards the inverse design of molecules with target quantum mechanical properties. In University of Luxembourg Department Workshop. June 2022.
- Svensson, E., Hartog, P. AIDD Codebase: a Framework for Model Integration, Collaboration and Sharing. AIDD on-line seminar (June 22, 2022)
- Svensson, E., Hoedt, P.-J., Hochreiter, S., Klambauer, G. Robust task-specific adaption of drug-target interaction models. In ICML2022 Workshop on Women in Machine Learning. July 18th, 2022.
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- Sanchez-Fernandez, A., Rumetshofer, E., Hochreiter, S., and Klambauer, G. Contrastive learning of image-and structure-based representations in drug discovery. In ICLR2022 Workshop on Machine Learning for Drug Discovery. (April 29th, 2022)
- · Fallani, A., Medrano Sandonas, L. and Tkatchenko, A. Towards the inverse design of molecules with target quantum mechanical properties. In APS March Meeting. March 2022.
- Nahal, Y. A Survey on Human-in-the-loop Machine Learning on-line AIDD lecture (March 16, 2022)
- Andronov, M. Overview of the methods for chemical reaction prediction, Rising Stars in AI Symposium 2022 in KAUST, Thuwal, Saudi Arabia (March 13, 2022)
- Nahal, Y. Learning from user feedback to improve recommender models and potential applications to molecular design. In Finnish Center of Artificial Intelligence Virtual Drug Design Lab seminars. (March 1st, 2022)
- Fallani, A., Medrano Sandonas, L. and Tkatchenko, A. Towards the inverse design of molecules with target quantum mechanical properties. In DQML Hintertux joint conference. February 2022.
- Masood, A., Heinonen, M., Herman, D., Ceulemans, H. Kaski, S. Dos-Time dependent DILI modeling. In Finnish Center of Artificial Intelligence Virtual Drug Design Lab seminars. (February 8th, 2022)

Program of the First AIDD School in Munich

			Building 57	/ Room 052	Building 57	/ Room 052	Building 57	/ Room 052	B56/ R160a/b	Building 57	/ Room 052				
First week	18.1	0.21	19.1	0.21	20.10.21		21.10.21			22.10.21					
Time	Mon	day	Tues	day	Wedn	esday	Thursday		-	Frie	lay				
10:00-11:00			RDkit: basics	Gregory Landram, Zoom	Workshop on	Thomas				Reinforcement Learning	Jose Arjona, mins				
11:00-12:00			History of AI	Mark Embrechts, live	PyTorch	Viehmann	Transformers for Computer Vision	Thomas Unterthiner, Zoom		Reinforcement Learning	Philipp Renz, 45 mins				
12:00-13:00			Lur	nch	Lur	nch	Lunch			Lunch					
13:00-14:00			How did we do deep learning in the BIGCHEM: experiences, challenges and opportunities	Josep	Neural networks: tricks of the trade	Pieter-Jan Hoedt, 45 mins, Zoom	Python: advanced (numpy, decorators, network)	Andreas Poehlmann, Zoom	Supervisory Board					SMILES based modelling, tools and models	Esben Jannil Bjerrum, Zoo
14:00-15:00			Introdcution to chemoinformatics	Tropsha	Workshop on	Thomas	QSAR: substructure analysis	Peter Ertl, Zoom		Introduction to best practices	Samuel Genheden, Zoom				
15:00-16:00			Personal presentations of ESRs (5 people)	ESR1-ESR6	PyTorch	Viehmann	Introduction to modeling chem reactions with ML	Marvin Segler, Zoom	General Assembly	Recurrent networks, LSTM, and transformer	Michael Widrich, Zoor				
16:00-17:00	Welcome party, SeeHaus in Englischen Garten														
	Building 57 / Room 052 25.10.21		Building 57 / Room 052 26.10.21		Building 57 / Room 052 27.10.21		Building 57 / Room 052 28.10.21		29.10.21						
Second week	Mon	day	Tues	day	Wedn	esday	Thursday		Friday						
10:00-11:00			Python: testing	Samuel Genheden, Zoom											
11:00-12:00	QMAR: quantitative cell morphology-activi ty relationships	Adam Arany, live	Python: questions and answers	Andreas Poehlmann, Zoom	Optical chemical structure recognition	Clevert, live	Computational Cancer Pharmacogenomi cs	Michael Menden	Die Josefsthaler Wasserfälle						
12:00-13:00	Lunch		Lur	nch	Lur	nch	Lur	nch							
13:00-14:00	Atomic Simulation Environment (ASE)	Leonardo Medrano Sandonas (live)	Molecular property prediction	Andreas Mayr	Convolutional Neural Networks	Mark Embrechts, live	Similarity-based data mining with applications to drug discovery	Petra Perner	https://docs.google.com/document/d /1FNgqjcD-x1oiizutOIXzljJG3sdNml xdK1tZDVQrD1g/edit?usp=sharing						
14:00-15:00	Introduction to Reaction Informatics Coffee	Igor Baskin, Zoo break	High Performance Computing / Python (cluster, muli-GPU, etc)	Martijn Oldenhof, live	Placebo		Personal presentations of ESRs (5 people)	ESR7-ESR11							
	Control		Coffee	break		Hans Georg									
15:00-16:00	Molecular representations	Rafael Gomez-Bombar elli, Zoom	Structure Query Language: basics	Pavel Karpov, live	Recurrent Neural Networks	Zimmerman	Personal presentations of ESRs (5 people)	ESR11-ESR16							
16:00-17:00	Accelerated data science with applications in natural language processing	Anthony (Nvidia)	Generative models and optimization for molecules	Rocío Mercado, zoom, US			Organic reactions modeling: start-of-the-art and perspectives	Connor W. Coley, Zoom							
17:00-18:00	Introduction to CUDA with Python	Christian Hundt (Nvidia)													

Fellows attending School in Lugano



Social activities: boat excursion in Belgium

1 You Retweeted



BioLearning_KULeuven @BioLearning_KUL · Oct 22, 2022 @AiddOne 3rd school social. Ghent visit, and experimenting with herbal extract flavours in beer.

...



Outreach activities: Pint of Science in Munich pub



AIDD @AiddOne · May 22

...

Paula @PTorrenPeraire explains the challenges to synthesize new active molecules



Explainable AI for molecules - https://aichemist.eu



Created with **BioRender.com**



Hyun Kil Shin • 1st

Artificial intelligence in chemistry

South Korea

Experience: Korea Institute of Toxicology, University of Science & Technology (UST), and 2 more

Number of applications per ESR position (BIGCHEM)



Science and entrepreneurship

UBC lands massive licensing deal for cancer drug



Researcher Artem Cherkasov displays a computer model simulation used to develop a new treatment for drugresistant prostate cancer at the Vancouver Prostate Centre . 'Using computer simulations, we sometimes go through 50 million compounds to find a molecule that will seat in a precise and accurate way,' he says. Photograph by: Steve Bosch, PNG

Under the terms of the agreement with Roche, UBC and VCHRI receive an upfront payment and up to \$141.7 million US in milestone payments if the drug moves through pre-clinical and clinical trials, regulatory approval and meets sales targets, and then royalties thereafter.

http://vancouversun.com/news/staff-blogs/ubc-lands-massive-licensing-deal-for-cancer-drug

ADDUCT Organization & Infrastructure



Slide courtesy of Prof. A. Cherkasov

First-in-class drug for blood cancers discovered by Ontario researchers receives record-setting industry investment



Years of hard work by OICR's Drug Discovery group and Ontario partners moves potential new treatment for leukemia towards clinical trials

On January 29, 2019, Celgene Corporation made an investment of up to US\$1 billion that will facilitate further research and development of the potential drug and support clinical trials in Ontario. The potential drug was designed to exploit a weakness in leukemia centred on the protein WDR5 that was discovered by Ontario researchers.

https://news.oicr.on.ca/2019/01

Example of GO-Bio funding in Germany

GoBio program



(Quelle: Ex-post-Evaluation der KMU-Förderung des BMBF in der Biotechnologie (ZEW 2012), modifiziert)

https://www.go-bio.de/gobio/shareddocs/downloads/de/praesentation_gb8170302.pdf

Financing rounds



https://www.go-bio.de/gobio/shareddocs/downloads/de/praesentation_gb8170302.pdf



Firma	Sitz	Gründung
Corimmun	Martinsried	2006
pluriSelect	Leipzig	2006
Elara Pharmaceuticals	Heidelberg	2006
ChromoTek	Martinsried	2008
Riberin	Radebeul	2009
BioNTech RNA Pharmaceuticals	Mainz	2009
FreiBiotics	Freiburg	2009
ethris	Martinsried	2009
iThera Medical	Oberschleißheim	2010
TissUse	Berlin	2010
SYNIMMUNE	Tübingen	2010
Eupheria Biotech	Dresden	2010
Cortec	Freiburg	2010
eADMET	Oberschleißheim	2010
Agroprotect	Aachen	2010
PSites Pharma	Frankfurt	2011
CCRP Therapeutics	Berlin	2011
Dynamic Biosensors	München	2012
BianoScience	Zwickau	2012
ImevaX	München	2014
Rigontec	Siegburg	2014
Zellkraftwerk	Leipzig	2014
SenseUp	Jülich	2015
Signatope	Reutlingen	2016

CorTec COT MMUN GmbH iTheraMedical Imeva **Immune Evasion Vaccines** DYNAMIC BIOSENSORS 📑 riboxx RNA-INTERFERENCE IN A BOX Euphoric About PHENOTYPES **RNA** Pharmaceuticals this Ychromotek new tools for better research •••• **RIGONTEC** ANTIBODIES FOR LIFE ZELLKRAFTWERK **BianoScience X**SSUSE Emulating Human Biology





https://www.go-bio.de/gobio/shareddocs/downloads/de/praesentation_gb8170302.pdf

Bundesministerium für Bildung und Forschung

16.06.2020 | GO-BIO

Neues Therapie- und Diagnoseverfahren zur Behandlung von autoimmunbedingter Herzschwäche

GO-Bio Runde 1 - PD Dr. med. Roland Jahns - Medizinische Klinik und Poliklinik I, Universitätsklinikum Würzburg | corimmun GmbH



© Leonid Andronov - Fotolia

Zuwendungsempfänger: Julius-Maximilians-Universität Würzburg Förderung: GO-Bio Phase I (01.04.2007 bis 30.09.2008, 970.397 Euro)

Zuwendungsempfänger: Corimmun GmbH Förderung: GO-Bio Phase II (01.10.2008 bis 31.03.2011, 2.056.802 Euro)



Weitere Informationen

 Medizinische Klinik und Poliklinik I, Universitätsklinikum Würzburg
 Positive Phase-II-Ergebnisse für Revacept bei AdvanceCor

Example of a successful exist of a Go-Bio project

AdvanceCor emerged from Corimmun GmbH after **100 million US dollars (in 2012) investment by Janssen.** The founding of Corimmun was supported by the BMBF as part of the GO-Bio funding.



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A strong team

Well-known founders, convinced investors and research-strong employees: Together we are advanceCOR GmbH.



The beginnings

advanceCOR exists since June 2012 and emerged from Corimmun GmbH, which was sold to Janssen Cilag GmbH/Johnson & Johnson. The founding team includes well-known scientists, who still actively shape the course of advanceCOR today.

12.11.2020 | GO-BIO Entwicklung innovativer Impfstoffe gegen Krebserkrankungen

GO-Bio Runde 1 – Prof. Dr. med. Ugur Sahin – Experimentelle Onkologie, III. Medizinische Klinik, Johannes Gutenberg-Universität Mainz | BioNTech RNA Pharmaceuticals GmbH



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Zuwendungsempfänger: Universitätsmedizin der Johannes Gutenberg-Universität Mainz Förderung: GO-Bio Phase I (1.3.2007 bis 28.2.2010, 1.242.119 Euro)

Zuwendungsempfänger: BioNTech RNA Pharmaceuticals GmbH Förderung: GO-Bio Phase II (1.3.2010 bis 31.12.2013, 2.892.862 Euro)



 ⁷ III. Medizinische Klinik, Johannes Gutenberg-Universität Mainz
 ⁷ BioNTech RNA Pharmaceuticals GmbH



Ugur Sahin · 1st

Professor for Translational Oncology and Immunology at University Medical Center Mainz

in Top Voice

Mainz, Rhineland-Palatinate, Germany · Contact info

204,857 followers



Dr. Philipp Julian Köster, MBA, Raymond Barlow, and 54 other mutual connections







University of Cologne



BioNTech an der Nasdaq

Der Mainzer BioNTech SE gelang der Sprung an die amerikanische Technologiebörse Nasdaq. Das Unternehmen nahm mit seinem Börsendebüt 150 Mio. US-Dollar ein.



Market Summary > BioNTech SE - ADR

108,57 USD

+94.75 (685.60%) + past 5 years

10 Jul, 10:10 GMT-4 • Disclaimer



04.10.2006 | GO-BIO Die Toxizität von Wirkstoffen und Chemikalien berechnen

GO-Bio Runde 1 - Dr. Igor Tetko - Institut für Bioinformatik und Systembiologie (IBIS), Helmholtz Zentrum München | eADMET GmbH



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Zuwendungsempfänger: Helmholtz Zentrum München Deutsches Forschungszentrum für Gesundheit und Umwelt (GmbH) Förderung: GO-Bio Phase I (01.04.2007 bis 31.03.2011, 705.742 Euro)

Zuwendungsempfänger: eADMET GmbH Förderung: GO-Bio Phase II (01.04.2011 bis 31.03.2014, 809.844 Euro)



Weitere Informationen

Institut f
ür Bioinformatik und Systembiologie (IBIS)
 eADMET GmbH

Go-Bio 1st round, Award ceremony, 2006



Özlem Türeci, Roland Jahns, Annette Schavan

Topics from the Go-Bio GründungsGespräche

GG1 - Nov. 2007 - IP-strategy and coaching GG2 – March 2008 - Business plan and preparations of financing negotiations GG3 - Nov. 2008 - The first round of financing - requirements and factors of success GG4 - March 2009 - Clinical studies – an introduction GG5 - Nov. 2009 - Management GG6 - March 2010 - Quality management GG7 - Nov. 2010 - Business game "Risky Business" (development of pharmaceuticals) GG8 - May 2011 - Negotiation management GG9 - Dec. 2011 - Contract design GG10 - May 2012 - Presentation technique, customer and investor approach GG11 - Dec. 2012 - IP and company takeover GG12 - Apr. 2013 - Experience reports from GO-Bio founders GG13 - Dec. 2013 - Team development and HR management GG14 - May 2014 - Coaching GG15 - Dec. 2014 - Financing GG16 - May 2015 - Governance, risk management & compliance (GRC) GG17 - Nov. 2015 - Company simulation GG18 - June 2016 - Contract design and team pitch GG19 - Dec. 2016 - Experience reports GG20 - May 2017 - IPO GG21 - Dec. 2017 - Corporate Communications GG22 - June 2018 - Clinical Studies GG23 - Dec. 2018 - Business simulation game GG24 - May 2019 - Coaching, business etiquette, team development GG25 - Nov. 2019 - Contract law GG26 - Nov. 2020 - IP-strategy GG27 – June 2021 - Financing GG28 – Dec. 2021 - Business plan GG29 - Jun 2022 – Contracts and contract negotiations GG30 - Sep 2022 – Business simulation GG31 - May 2023 - Team, Team, Team!

GründerGespräche

Know-how: The 'GründungsGespräche' provide the GO-Bio teams with helpful and practical information to prepare them for setting up a running their company.



A chronology of entrepreneurship









NEWS	INVENTORS	FOUNDERS	INDUSTRY & INVESTORS	OUR IP-PORTFOLIO
28.04.2023 BioVaria Startup Pitch & Partner Awards go to Ceridwen Oncology and Lactabico	Protect, develop and commercialize ideas	Initiate and finance start-ups	Discover innovation opportunities	Search over 700 technologies and research materials
28 April 2023, Munich – A record number of over 270 innovators from academia and industry				
Read more »				







START-UPS

Start-ups

Getting start-ups off the ground

Supporting start-ups is a particular focus of our work. We have already accompanied over 100 start-up projects. You too can benefit from our experience!

As a company founder:

Together, we create favourable starting conditions, avoiding the mistakes that others have made before. We also connect you to the right people: investors, partners, potential customers.

As a partner institute:

Offer your entrepreneurial scientists optimal support – without having to build up internal resources and know-how. You profit from the proceeds that come from our equity in successful start-ups. These are distributed by the LifeScience Foundation, mainly as grants to be used as desired by the originating institutes.

As an investor:

Discover our attractive start-up projects with a strong IP footing - before they become visible to a broader public at regular industry events.



Sergii Novotarskyi · 1st Software Engineer at Facebook London, England, United Kingdom · Contact info 175 connections



Joachim Vogt · 1st Director, Search and Evaluation International at Abł Ludwigshafen Am Rhein, Rhineland-Palatinate, Germany · 500+ connections

eADMET core team



Yurii Sushko - 1st Software Engineering Manager at Google Greater Munich Metropolitan Area - Contact info 365 connections



Dr. Ahmed Sayed, MBA () (He/Him) · 1st EMEA Leader - Prof. Services Emerging Tech (AI/ML, Analytics, IoT, Blockchain, ...)

Greater Munich Metropolitan Area \cdot Contact info



Ascenion, eADMET and BIGCHEM (all GmbH) are spin-offs of the center

HELMHOLTZ MUNICI



Spin-Offs

ERC Grants
Data storage and model development: http://ochem.eu



Physiological and physical–chemical barriers affecting a drug bioavailability.



Adapted from Kerns, E. H.; Di, L. Pharmaceutical Profiling in Drug Discovery. Drug Discov. Today 2003, 8, 316–323. Copyright (2003), with permission from Elsevier.

See also Ratkova, E. L. et al Empirical and Physics-Based Calculations of Physical–Chemical Properties. In *Comprehensive Medicinal Chemistry III*, Chackalamannil, S.; Rotella, D. P.; Ward, S., Eds.; Elsevier: Oxford, 2017; Vol. 3, pp 393-428.

ADMETox filters in Bayer

	Insufficient quality	First approach	Medium model	Good	model	Robust model			
	Endpoint	Model type	Data set	size	2005	2009	2014	2019	Retraining
	Caco-2 permeation	C (N)	>10 00	00			RF	SVR	Weekly
Absorption	Caco-2 efflux	C (N)	>10 00	00			RF	SVR	Weekly
	Bioavailability (rat)	С	~200	~2000				RF	On demand
Distribution	Human serum albumin	N	>30 00	00			PLS	MTNN	On demand
Distribution	Fraction unbound	N	>100	>1000			PLS	MTNN	On demand
	Microsomal stability (hum)	C (N)	>10 00	00			RF	RF	Weekly
Metcheliem	Microsomal stability (mouse)	C (N)	>10 00	00			RF	RF	Weekly
Metabolism	Microsomal stability (rat)	C (N)	>10 00	00			RF	RF	Weekly
	Hepatocyte stability (rat)	C (N)	>30 00	00			RF	RF	Weekly
	hERG inhibition	С	>10 00	00			RF	SVM	Weekly
	Ames mutagenicity	С	>10 00	00			RF	RF	On demand
Toxicity	CYP inhibition isoforms	С	>10 00	00			RF	RF	On demand
	Phospholipidosis	С	<100	0			SVM	SVM	On demand
	Structure filter tool	Score	n.a.		-	-	-	-	On demand
	Solubility (DMSO)	N	>30 ,0	00			PLS	MTNN	On demand
	Solubility (Powder)	N	<10 00	00			PL5	MTNN	On demand
	logD @ pH 7.5	N	>70 00	00			PLS	MTNN	On demand
PhysChem	Membrane affinity	N	<10 00	00			PLS	MTNN	On demand
	рКа	N	>10 00	00			ANN	ANN	On demand
	Oral PhysChem score	Score	n.a.		-	-	-	-	On demand
	i.v. PhysChem score	Score	n.a.		-	-	-	-	On demand

Drug Discovery Today

Göller, AH et al Drug Discov. Today 2020, 25 (9), 1702-1709.

Bayer workflow for model life cycle



Göller, A.H. et al. Drug Discov. Today 2020, 25 (9), 1702-1709.



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eADMET GmbH offers and innovative IT solutions to predict important properties of chemicals and drugs - physical and so-called ADME/Tox- ("druglike") characteristics. The central product of eADMET is "OCHEM", a Web-based database and modeling system that ...

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Training

Meet us at

- lecture "On-line Chemical Modelling" Environment" at Enamine Ltd. November 1, 2013; Kyiv, Ukraine
- 9th German Conference on Chemoinformatics November 10-12, 2013 ; Fulda, Germany
- Big data in Life Science and ICT November 12, 2013; Munich, Germany
- Third investment Forum November 19, 2013; Berlin, Germany
- 2nd Workshop Structural Biology in the Helmholtz Association November 28-29, 2013; ; Munich, Germany



OCHEM

OCHEM is our platform for the creation of in silico ADME / Tox prediction models. We offer a free version of the modeling development environment for academic use.

Free Version



ePhysChem

Using ePhysChem the physical properties of substances can be assessed quickly. ePhysChem contains AlogPS 3.01 for logP and logS prediction and many other models. Try our free version!

Free Version



from our scheduled courses we can offer you and your team with individualized training content about QSPR, QSAR and in silico ADME / Tox

Our next in silico ADME/T training

courses start in Winter 2014. If you

are interested in a course or have



Consulting

We create models for you and carry out literature and database searches. Get models built on with thousand of external and internal measurements - maximizing the information content of your data and getting a clear view on the achievable accuracy of in silico predictions for your compounds. Quickly and inexpensively.

Key issues for *in-silico* ADME/Tox



eADMET in-silico tools

- Need structure information only, Identify poor predictions.
- Saves time and costs in R&D
- Fail early, fail fast, fail cheap

but

In-vitro and *in-vivo* testing of actual compounds are considered <u>more reliable</u> than *in-silico* tools



Key feature: accuracy estimation

Method	Costs	Time	Quality
Blind <i>in-vitro</i> testing of all compounds			
Blind <i>in-silico</i> prediction of all compounds			
eADMET: <i>in-silico</i> prediction plus intelligent testing of selected compounds			

Data storage and model development: http://ochem.eu



Welcome to OCHEM! Your possible actions

Explore OCHEM data

Search chemical and biological data: experimentally measured, published and exposed to public access by our users. You can also upload your data.

Create QSAR models

Build QSAR models for predictions of chemical properties. The models can be based on the experimental data published in our database.

Run predictions

Apply one of the available models to predict property you are interested in for your set of compounds.

Screen compounds with ToxAlerts

Screen your compound libraries against structural alerts for such endpoints as mutagenicity, skin sensitization, aqueous toxicity, etc.

Tutorials Check our video tutorials to know more about the OCHEM features.

Our acknowledgements

Feedback and help

User's manual Check an online user's manual

v.4.2.11 Iog in create account A+ a- Privacy statement Check out the properties available on OCHEM Latest active users Brandon: Mr. Brandon Gundani OCHEM contains 3642695 records for 639 properties (with at least 50 records) collected from 18178 sources seconds ago Melting Point logPow logBB LogL(water) LogD logPI(+) Water solubility LogL(blood) uddiptagd: Mr. Uddipta Ghosh Dastidar P/Papp Cbrain/Cplasma IC50 Papp(Caco-2) Papp(MDCK) Oral absorption LIC 50 seconds ago ivalex.09: Dr. Alexander Ksenofontov Cheart/Cplasma Papp ratio(Caco-2) Plasma protein binding Papp ratio(MDCK-mdr1) pIC50 %Human FA seconds ago Human IA Human FA fraction unbound (fu) fraction ionized (fi) pKa VDss LogIC50 LogPI Rahila: Mrs. Rahila Pathan BBB permeability (qualitative) LogKoa LogRBA CYP450 modulation seconds ago CYP450 reaction Vapor Pressure EC50 aquatic NOEC aquatic LOEC aquatic IC50 aquatic rama1: Mr. Rama Krishnan 6 minutes ago LC50 aquatic log(IGC50-1) LEL Henry's law constant Photolysis rate Kp Half-Life Hydrolysis HLh Amidoff: Dr. Dmitriy Makarov EC50 EROD induction LC 50 LCLo Boiling Point LD50 dermal LD50 oral LC50 terrestrial AMES LD50 9 minutes ago Biodistribution Water solubility at pH Papp(PAMPA) IC50 CYP450 Inhibition Ki CYP450 logK' hsa Latest published models Dissipation half-life DT50 Freundlich coefficient Kr BMF Atmospheric OH Rate Constant Ki TDLo LD LDLo Cancerogen AntioxidantActivity_IC50 model published by vkovalishyn Anti-Inflammatory activity LogLD50 MIC Retention Time Surface tension Critical micelle concentration about a month ago Cblood/Cair(Human) Cfat/Cair(Rat) Cbrain/Cair(Rat) Cliver/Cair(Rat) Cmuscle/Cair(Rat) IC50 PDE4 % inhibition PDE4 IC50 inhibition Absorbance maximum wavelength model published by AlexeyR Density pKa (smiles as ob. cond.) DMSO Solubility log Kb logK0 logLOAEL 2 months ago hERG K+ Channel Blocking (IC50) 5-HT2B (Ki) LogKoc BCF CHSEL Cryptic Pocket Inducer model published by Zhonghua % inhibition hERG, K+ Channel Blocking hERG K+ Channel Blocking (Ki) logP Chloroform/Water 5-HT2C (Ki) 5-HT2b (Kb) 4 months ago Pap substrate 5-HT2A (Ki) D2R (Ki) a1 adrenergic receptor (Ki) 5-HT2b (IC50) Modes of Toxic Action LC50 ratio nephrotoxic-binary model published by qingshuang0501 Solid-liquid total phase change entropy enthalpy of fusion % inhibition PgP PgP modulator PgP inhibitor 5 months ago Bioaccumulation in C. elegans PgP inducer PTP1B inhibition(pl) IC50 HIV TD50 Skin permeability Human Clearance MRT Mean Residence Time t1/2 Ki trypsin AC50 Trypsin Inhibition Growth inhibition AlphaScreen-GST-FHs model published by dipanHZM Trypsin Inhibition activity Trypsin Inhibition class Cell permeability test Ki trypsin FDA classification CAESAR class GHLI 6 months ago Ki inhibitor trypsin Anti-Cancer activity CA Chromosomal Aberration Index LD50bee Papp(RI) Absorbance maximum wavelength model published by ivalex.09 skin sensitisation:LLNA index Mutagenicity EC50 bioluminescence AhR binding affinity EC50 AHH Induction EC50 7 months ago Antimicrobial activity NanoToxicity LC50 aquatic NanoToxicity MIC NanoToxicity mortality NanoToxicity EC50 Melting Point model published by Amidoff 7 months ago Genotoxic carcinogenicity, mutagenicity Flash point Bioaccumulation Factor (BAF) 5-LOX(1) MIC model published by hodyna more than a year ago Ready biodegradability Binding constant HIV EC50 HIV IC50 Biological Oxygen Demand ppi-inhibitor Toluene solubility logPtw HIV Active Compounds logPchlor/w logPcycl/w IC50 cell proliferation IC50 model published by carpovpv more than a year ago IC50 tubulin IC50 telomerase logERRBA (qualitative) SRC2 Inhibitor IC50 FPPS log RP AR km (biotransformation rate) Severe Skin Disorder logPhxd/w logPalk/w tubulin inhibitors AlphaScreen-FHs Delta density of mixtures model published by xenol herg_act_inact phospholipidosis status Retention Factor Chromatographic Hydrophobicity Index logKd DILI more than a year ago Abraham descriptor A Abraham descriptor B Abraham descriptor S Abraham descriptor E LC50 aquatic model published by Tinkov_Oleg more then a year of

Modeling iterative workflow



Traditional representation of chemical structures



Examples of descriptors

alvaDesc v.2.0.4 (5666/3D)

[select all] [select none] [select 3D] [unselect 3D]

- Constitutional descriptors (50)
- Topological indices (79)
- Connectivity indices (37)
- 2D matrix-based descriptors (608)
- Burden eigenvalues (96)
- ETA indices (40)
- Geometrical descriptors (3D, 38)
- ✓ 3D autocorrelations (3D, 80)
- ✓ 3D-MoRSE descriptors (3D, 224)
- GETAWAY descriptors (3D, 273)
- Functional group counts (3D, 154)
- Atom-type E-state indices (346)
- 2D Atom Pairs (1596)
- Charge descriptors (3D, 15)
- Drug-like indices (30)
- WHALES (3D, 33)
- Chirality (70)

- Ring descriptors (35)
- Walk and path counts (46)
- Information indices (51)
- 2D autocorrelations (213)
- P_VSA-like descriptors (69)
- Edge adjacency indices (324)
- 3D matrix-based descriptors (3D, 132)
- RDF descriptors (3D, 210)
- WHIM descriptors (3D, 114)
- Randic molecular profiles (3D, 41)
- Atom-centred fragments (115)
- Pharmacophore descriptors (165)
- ✓ 3D Atom Pairs (3D, 36)
- Molecular properties (3D, 27)
- CATS 3D (3D, 300)
- **MDE** (19)

QSPR/QSAR modelling in OCHEM

elect the molecular descriptors 🕕		Create a model 🕕 Select the training and validation sets, the machine learning method and the validation protocol
Recommended descriptor types (2D)	Predictions by OCHEM's featured models	
OEState	Ames levenberg	Select the training and validation sets:
Bonds Indices Counts only ALogPS (2) Mold2 (777) CDDD JPlogP SIRMS SIRMS SIRMS SIRMS GSFragment (1138) QNPR	Toxicity against T. Pyriformis ALogPS 3.0 CYP1A2 Estate+ALogPS CYP2C9 Estate+ALogPS CYP2C9 Estate+ALogPS CYP2C9 Estate+ALogPS CYP2C9 Estate+ALogPS CYP3A4 Estate+ALogPS Pyrolysis point prediction (best Estate) Melting Point prediction (best Estate) Water solubility model based on logP and Melti ALOGPS 2.1 logP ALOGPS 2.1 logS	Training set (required): peptidesregr [details] Add a validation set The model will predict this property: LogD using unit: Log unit Skip model configuration and use the predefined settings Choose the learning method:
 Multilevel Neighborhoods of Atoms (MNA) Structural alerts (ToxAlerts and Functinal Groups) 	Outputs of other OCHEM models	Suggested modeling methods:
Recommended descriptor types (3D)	Obsolete/Additional descriptor types	○ ASNN: ASsociative Neural Networks doi:10.1007/978-1-60327-101-1_10 ○ (New) Attentive FP doi: 10.1021/acs.jmedchem.9b00959
 alvaDesc v.2.0.4 (5666/3D) Dragon v. 7 (5270/3D) CDK 2.7.1 descriptors (256/3D) Chemaxon descriptors (499/3D) RDKit descriptors (3D) MORRED descriptors (1826/3D) MOPAC2016 descriptors (35/3D) KrakenX descriptors (MOPAC2016 derived)(124/3D) PyDescriptor descriptors (16251/3D) MERA descriptors (529/3D) MERSY descriptors (54/3D) 'Inductive' descriptors (54/3D) Spectrophores (144/3D) 	 CDK 2.0 descriptors (256/3D) CDK 1.4.11 descriptors (256/3D) E-state Dragon v. 5.4 (1644/3D) Dragon v. 5.5 (3224/3D) Dragon v. 6 (4885/3D) MOPAC 7.1 descriptors (25/3D) 	 ChemProp MPNN for properly prediction (GPU) doi:10.1021/acs.jcim.9b00237 CNF - Convolutional Neural Network Fingerprint (GPU) doi:10.1007/978-3-030-30493-5_79 Transformer-CNF model Consensus model (based on models developed for the same set) DEEPCHEM: several methods from DeepChem (GPU) arXiv:1703.00564 (New) DIMENET - Directional Message Passing Neural Network arXiv:2003.03123 Deep Learning Consensus Architecture (DLCA) doi:10.1021/acs.jcim.9b00526 DNN: Deep Neural Network (GPU) doi:10.1021/acs.jcim.9b00526 DNN: Deep Neural Network (GPU) doi:10.1021/acs.jcim.9b00855 EAGCNG - Edge Attention based Multi-relational Graph Convolutional Networks (GPU) arXiv:1802.04944 FSMLR: Fast Stagewise Multiple Linear Regression doi:10.1134/S0012500807120026 GNN - Graph Isomorphism Network (GPU) arXiv:1910.13124 KNN: K - Nearest Neighbors KPLS - Kernel Partial Least Squares doi:10.1109/JCNN.2006.246832 LibSVM: grid-search parameter optimisation doi:10.1145/1961189.1961199
pecial descriptors (scaffolds, fingerprints): Chemaxon Scaffolds Silicos-It Scaffolds ECFP Fingerprints MolPrint Fingerprints		LISSVM 5: Least Squares Support Vector Machine (GPU) doi:10.1023/A:1018628609742 MLR: Multiple Linear Regression PLS: Partial Least Squares doi:10.1016/S0169-7439(01)00155-1 RFR: Random Forest regression and classification doi:10.1023/A:1010933404324 Transformer-CNN - Transformer Convolutional Neural Network (GPU) doi:10.1186/s13321-020-00423-w Transformer-CNN - faster Transformer-CNN (GPU) doi:10.1186/s13321-020-00423-w
onditions of experiments		 WEKA-J48: Weka C4.5 decision trees, only classification - use with bagging doi:10.1145/1656274.1656278 WEKA-RF: Random Forest, only classification doi:10.1023/A:1010933404324
□ pH □ lonisable		XGBoost: Scalable and Flexible Gradient Boosting doi:10.1145/2939672.2939785

Model validation

Validation method: N-Fold cross-validation -

Number of folds: 5

Stratified cross-validation (classification only)

Treat each record as a new molecule

You can create a model from template: import an XML model template or use another model as a template

Machine Learning directly from chemical structures



P. Karpov, G. Godin, I. V. Tetko, J. Cheminform. 2020, 12, 17.

https://github.com/bigchem/transformer-cnn

Winning model: OCHEM-generated consensus model

Andrea Kopp SLAS Europe 2023

25.05.2023

HELMHOLTZ MUNICH Team of Igor Tetko with

Team of Igor Tetko with Peter Hartog, Martin Šícho and Guillaume Godin



Challenge set-up

- Experimentally: Nephelometer measures undissolved sediment
- Classification into *low, medium* and *high* soluble with phenytoin and amiodarone as thresholds
- 70k training datapoints, 15k public leaderboard, 15k private leaderboard
- Stratified random sampling



Workflow with OCHEM



OCHEM for modeling

- Graphical interface allows comprehensive modeling without explicit coding
- Implementation for GPU and CPU use
- Consensus models:
 - Average over multiple models to improve prediction
 - Orthogonal models
 - Various descriptor sets/ molecular representations

etrics AUC S for Training set	C Valida	tion: Cros	s-Validati	on (84 mod
	LSSVMG	ASNN	PLS	KNN
ALogPS, OEstate	0.74	0.68	0.61	0.64
CDDD	0.8	0.74	0.75	0.71
CDK2 (cons,topol,geom,elec,hybrid) 3D:corina	0.75	0.71	0.56	0.71
ChemaxonDescriptors (pH 0 - 14:1) 3D:corina	0.76	0.7	0.59	0.68
Dragon6 (2D blocks: 1 28)	0.64	0.66	0.59	0.65
Dragon6 (3D blocks: 1-29) 3D:corina	0.76	0.72	0.57	0.65
Fragmentor (length:2 - 4)	0.72	0.7	0.59	0.63
GSFrag (F + L)	0.69	0.69	0.61	0.61
InductiveDescriptors 3D:corina	0.69	0.71	0.57	0.67
JPlogP	0.73	0.74	0.59	0.67
MAP4	0.71	0.65	0.59	0.67
MORDRED (All) 3D:corina	0.77	0.73	0.57	0.68
Mera, Mersy 3D:corina	0.73	0.69	0.55	0.67
OEstate	0.74	0.67	0.63	0.68
PyDescriptor 3D:corina	0.71	0.71	0.7	0.67
QNPR (length:1 - 3)	0.68	0.62	0.58	0.58
RDKIT (3D blocks: 1-11 15-16) 3D:corina	0.77	0.72	0.56	0.65
SIRMS (labels:charge+logp+hb+refractivity)	0.76	0.73	0.59	0.67
Spectrophores (accuracy=20) 3D:corina	0.68	0.6	0.52	0.6
StructuralAlerts	0.67	0.64	0.58	0.51
alvaDesc (3D blocks: (only) 1-30) 3D:corina	0.75	0.71	0.57	0.68



Quadratic kappa metric scores→

€PA inited States Environmental Protection Agency ALL EPA THIS AREA Advanced Search MARCH LEARN THE ISSUES | SCIENCE & TECHNOLOGY | LAWS & REGULATIONS | ABOUT EPA **Computational Toxicology Research** Contact Us You are here: EPA Home + Research & Development + CompTox + Chemical Data Challenges & Release Key Links CompTax Home **Research Projects Research Publications** Staff Profiles **Basic Information Chemical Databases** Scientific Reviews CompTax Partners Organization. ToxCast Stakeholder Events **Communities of Practice** Jobs and Opportunities EPA Exposure Research EPA Chemical Safety Research ToxCast Data Challenges

ToxCast Chemical Data Challenges and Release

EPA's high-throughput screening data on 1,800 chemicals is accessible through the interactive Chemical Safety for Sustainability Dashboards (ICSS dashboard). The ICSS dashboard provides user-friendly and customizable access to toxicity data from ToxCast and Tox21 high-throughput chemical screening technologies.

Using the TopCoder and InnoCentive crowd-sourcing platform, EPA invited the science and technology community to work with the data and provide solutions for how the new toxicity data can be used to predict potential health effects. The ToxCast data challenges focused on using this data and other publicly available data to predict the lowest effect level from traditional toxicity studies using laboratory animals. Challenge winners received awards for solving this challenge.

Key Links

- Lowest Effect Level Challenge Results (PDF, 497KB, 18pp)
- Chemical Safety for Sustainability Dashboards
- Complete ToxCast Phase II Data & Files
- TopCoder Challenge
- InnoCentive Challenge
- Stakeholder Workshops



Novotarskyi, S. et al. Chem. Res. Toxicol. 2016, 29, 768-75.



National Center for Advancing Translational Sciences

Tox21 Data Challenge 2014



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ns Su

Submissions

Discussion

Leaderboard Contact Us

Survey



Open call ends: November 14, 2014

About the Data 6



The Challenge

The 2014 Tox21 data challenge is designed to help scientists understand the potential of the chemicals and compounds being tested through the Toxicology in the 21st Century initiative to disrupt biological pathways in ways that may result in toxic effects.

The goal of the challenge is to "crowdsource"

All challenge winners will receive the opportunity to submit a paper for publication in a special thematic issue of Frontiers in Environmental Science and recognition on the NCATS website and via social media.

openOCHEM https://github.com/openochem

🗘 Overview 📮 Repositories 3 🗄 Projects 🛇 Packages 🏠 Stars

openochem / README.md

Open OCHEM -- AI models for drug discovery and environmental chemistry

The Open OCHEM is open source version of the On-line Chemical database and Modelling Environment Platform (http://ochem.eu)

It is a user-contributed repository of referenced experimental data, computational tools and models of ADMET properties of chemical compounds. The OCHEM algorithms can reliably identify compounds predicted with experimental accuracy: there is no need to test them in a lab. The OCHEM can be used for timely and low-cost identification of scaffolds with lower risks of failure due to the unfavorable physico-chemical and/or biological properties. The free open source of OCHEM is a reference system for academic users thus accumulating data and knowledge produced in academia. The developed OCHEM workflow allows an unbiased comparison of different existing and new machine learning algorithms which can be easily integrated in OCHEM by its users.

OCHEM software can be used to develop QSPR and QSAR models for various biological and physico-chemical projects. It can work with millions of molecules and can be configured to use hundreds of CPUs or GPUs. Open OCHEM allows you to install the fully functional version of the software and analyse your data privately. The closed source version is also available from BIGCHEM GmBH and provides several additional optimized software packages which were contributed by the company or its partners.

The open OCHEM currently supports tens methods and descriptors packages, which were developed and contributed by different providers and are distributed under the open source or respective license agreements (most of them are free of charge for academic, educational, recreational or evaluation purposes - check each respective license agreement).

See installation instructions how to install and run open the OCHEM.

We wish you a happy computing!

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Questions

1) What kind of difficulties that you have encountered? How did you overcome?
 2) How did you develop your career skills(such as technical skills for your job)?
 3) How we can learn to think as a researcher? Do you have any tips for that?
 4) Have you ever give up anything during your journey as a researcher?
 5) Do you have any recommendations to the students who are doing their masters degree before starting to pHd?

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Stiftung/Foundation

Alexander von Humboldt







