



Laboratorium Bioinformatyki i Analiz in silico

Prof. dr hab. Aleksander Mendyk
dr Jakub Szlęk



HARDWARE

- 2 serwery HPC
 - 1,5 TB RAM
 - 2x Xeon Gold
 - Nvidia RTX 6000
- 17 stacji roboczych PC
- macierz dyskowa 60 TB

> 1000 wątków
obliczeniowych

SOFTWARE

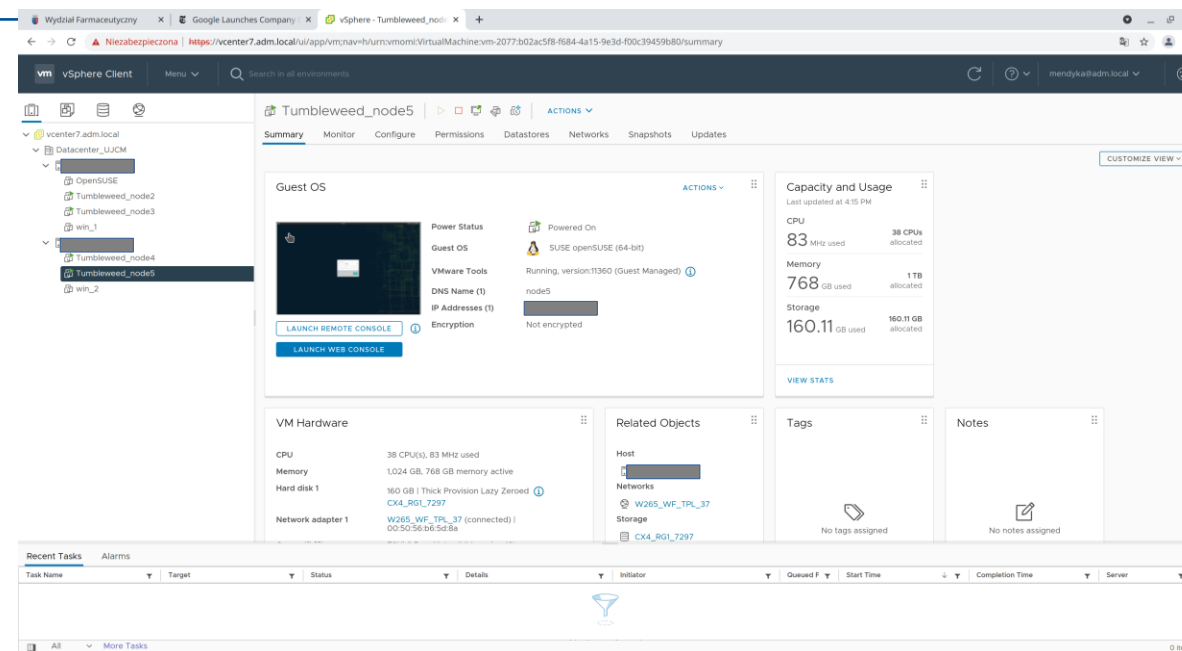
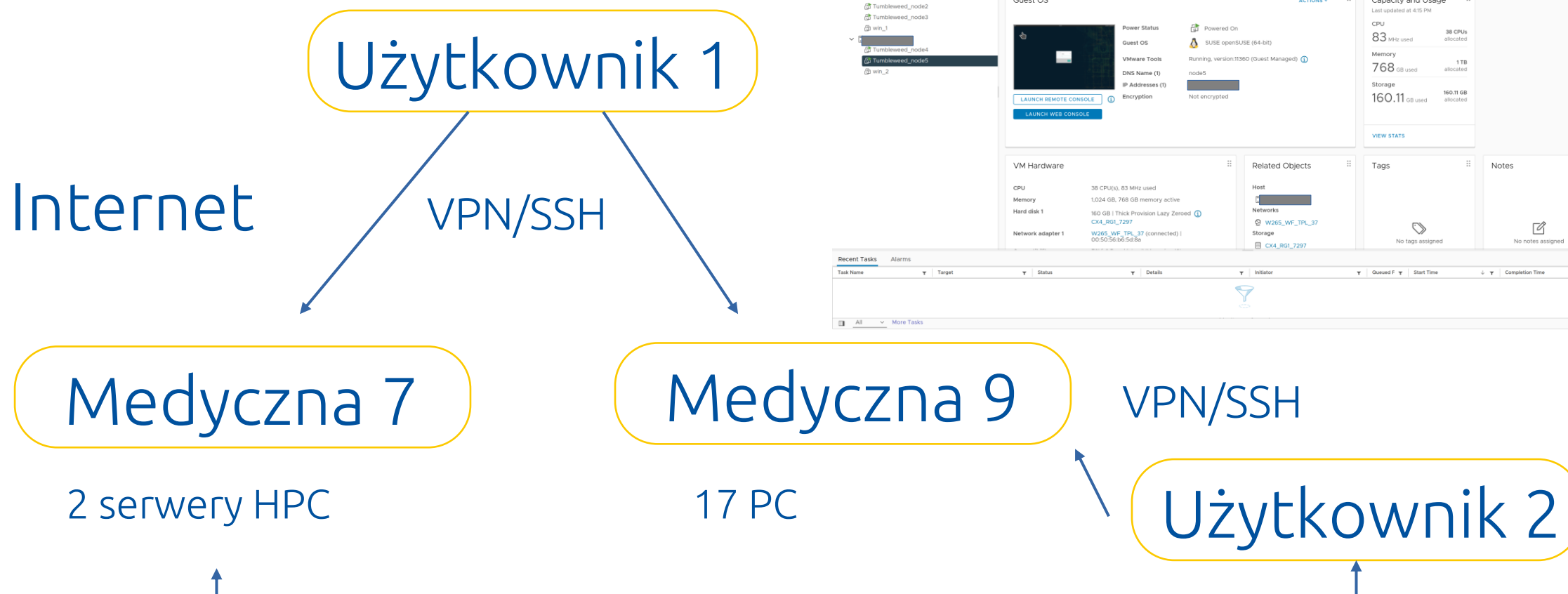
- Linux / Windows
- VMWare / Proxmox
- R / Python / Java
- H2O / mljar
- dso /PySR
- Tensorflow
- Orca, Psi4, Gromacs

METODY

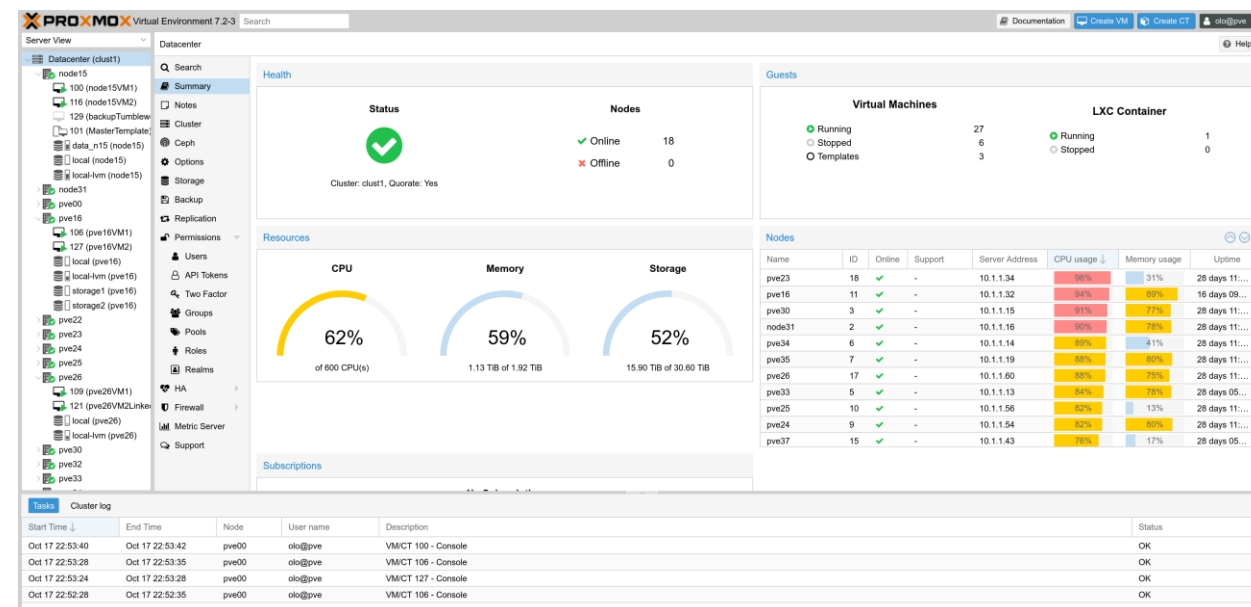
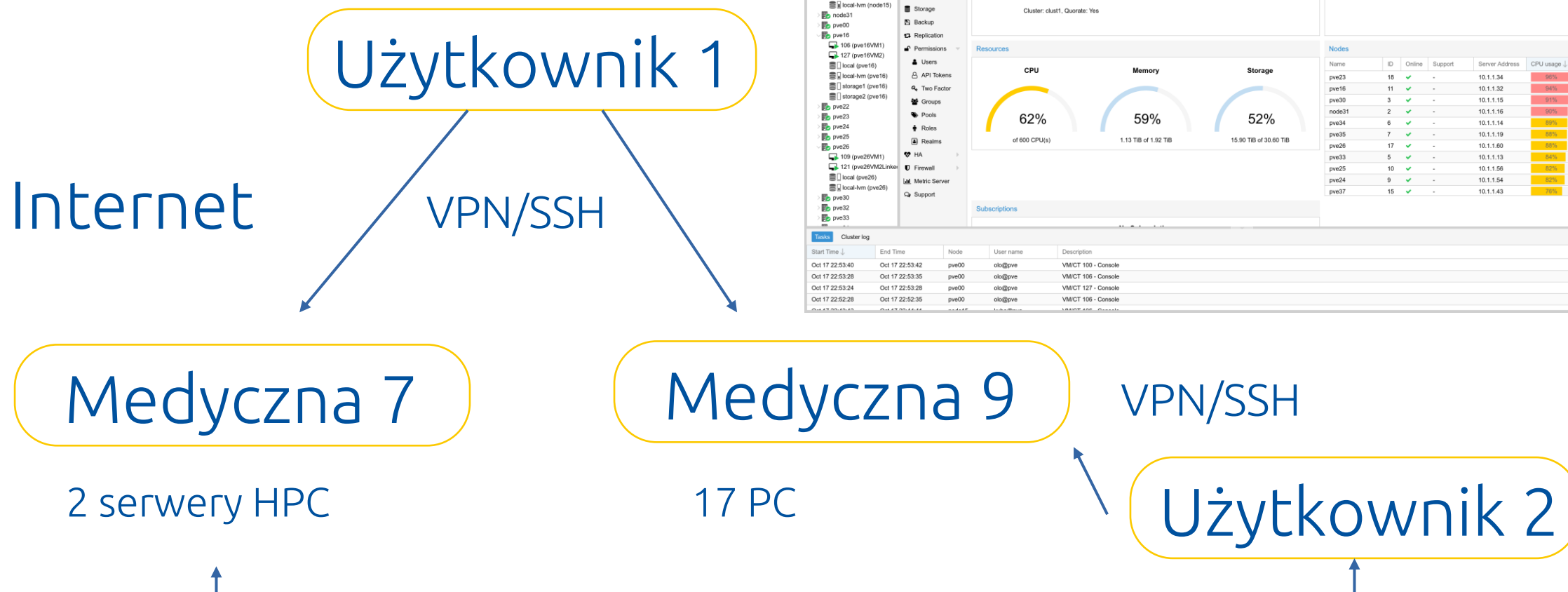
- statystyka
- AI/ML (Deep learning)
- informatyka chemiczna
- analiza obrazu
- GPU computing

ŚRODOWISKO “NA ŻYCZENIE”

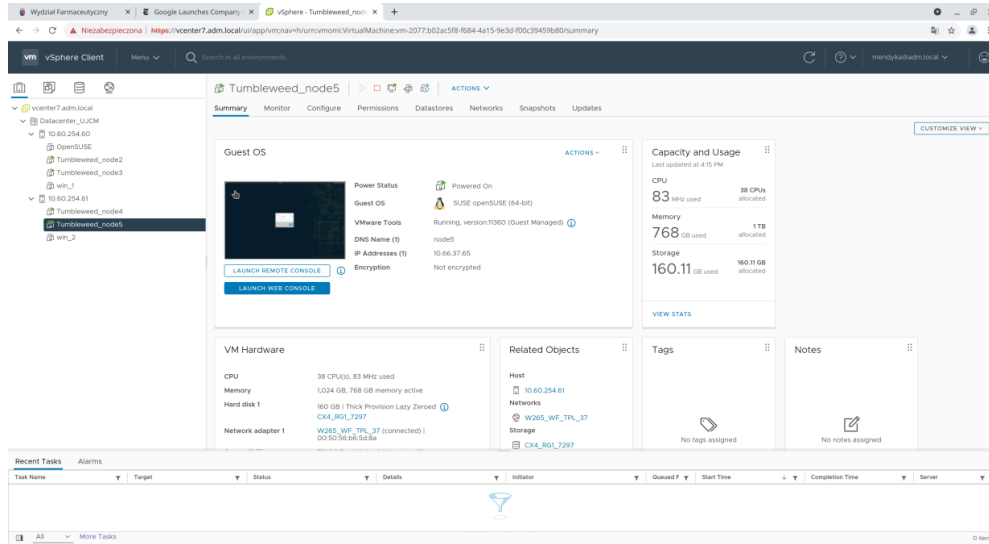
LBA – czym dysponujemy?



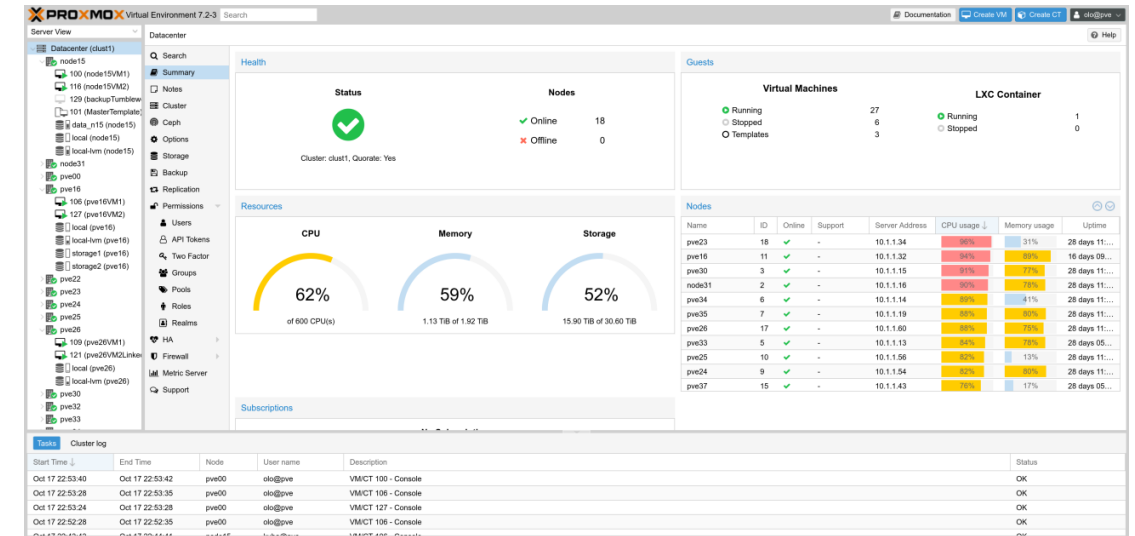
LBA – czym dysponujemy?



VMware



Proxmox



bash

rozproszenie

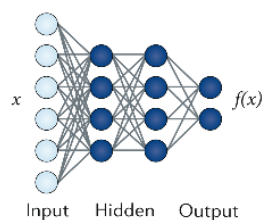
>10 000 jobs (randomForest, Cubist)

80 wątków (Orca, AutoML)

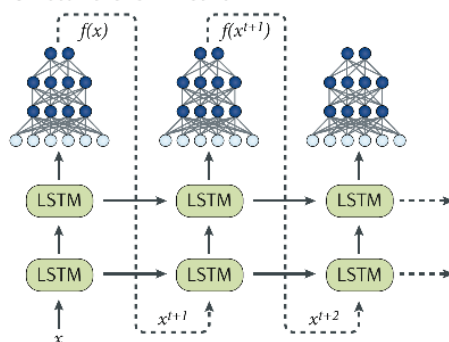
QSAR: AI/ML

LBA – co robimy?

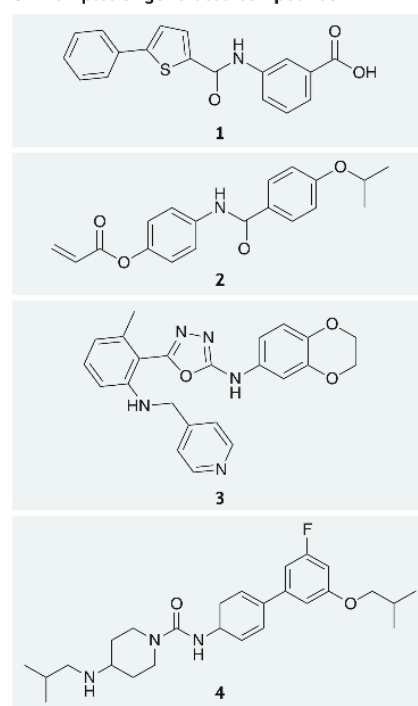
a Feedforward net



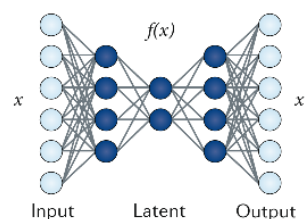
c Recurrent LSTM network



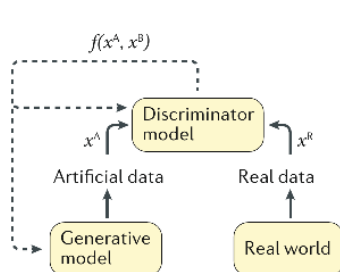
e Examples of generated compounds



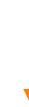
b Variational autoencoder



d Generative adversarial network



QSAR



revQSAR

Schneider P, Walters WP, Plowright AT, Sieroka N, Listgarten J, Goodnow RA Jr, Fisher J, Jansen JM, Duca JS, Rush TS, Zentgraf M, Hill JE, Krutoholow E, Kohler M, Blaney J, Funatsu K, Luebkeermann C, Schneider G. Rethinking drug design in the artificial intelligence era. *Nat Rev Drug Discov.* 2020 May;19(5):353-364. doi: 10.1038/s41573-019-0050-3. Epub 2019 Dec 4. PMID: 31801986.



QSAR: AI/ML

molecular informatics
models – molecules – systems

Research Article

Application of automated machine learning in the identification of multi-target-directed ligands blocking PDE4B, PDE8A, and TRPA1 with potential use in the treatment of asthma and COPD

Alicja Gawalska, Natalia Czub, Michał Sapa, Marcin Kołaczkowski, Adam Bucki, Aleksander Mendyk 

Curated Database and Preliminary AutoML QSAR Model for 5-HT_{1A} Receptor

by  Natalia Czub ,  Adam Paclawski *  ,  Jakub Szlęk  and  Aleksander Mendyk  

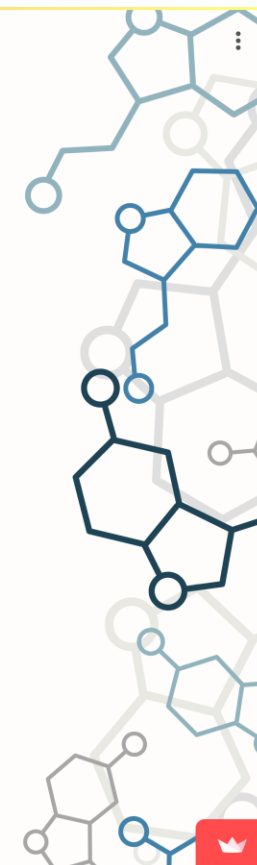
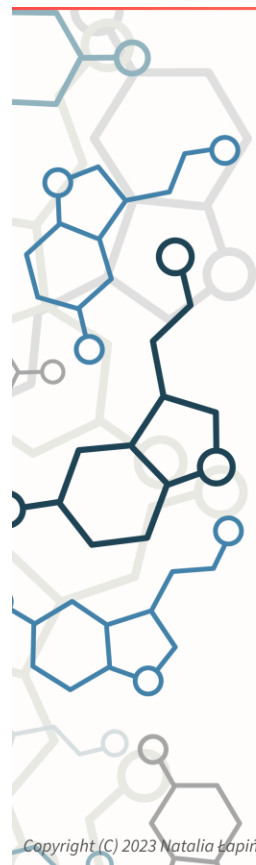
Department of Pharmaceutical Technology and Biopharmaceutics, Jagiellonian University Medical College, 30-688 Kraków, Poland

* Author to whom correspondence should be addressed.

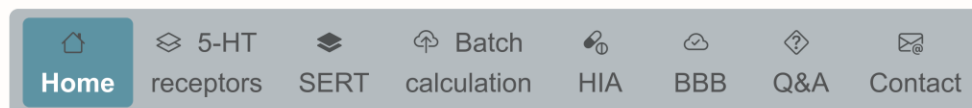
Pharmaceutics **2021**, *13*(10), 1711; <https://doi.org/10.3390/pharmaceutics13101711>

QSAR: AI/ML

<https://serotoninai.streamlit.app/>



SerotoninAI



Serotonin Science Revolution: Decipher Molecule's Affinity and Properties for Future Breakthrough Therapy!

Discover instant affinity predictions with our cutting-edge app, propelling your breakthroughs to new heights. Join the revolution shaping serotonergic studies and leave your mark on scientific progress!

Copyright (C) 2023 Natalia Gapińska (Czub)

QSPR: AI/ML

RETURN TO ISSUE | < PREV **ARTICLE** NEXT >

Artificial Intelligence-Based Quantitative Structure–Property Relationship Model for Predicting Human Intestinal Absorption of Compounds with Serotonergic Activity

Natalia Czub, Jakub Szlęk, Adam Paclawski*, Klaudia Klimończyk, Matteo Puccetti, and Aleksander Mendyk

✓ **Cite this:** *Mol. Pharmaceutics* 2023, 20, 5, 2545–2555

Publication Date: April 18, 2023 ▾

<https://doi.org/10.1021/acs.molpharmaceut.2c01117>

Copyright © 2023 The Authors. Published by American Chemical Society. This publication is licensed under

[CC-BY 4.0](https://creativecommons.org/licenses/by/4.0/).

Open Access

Article Views | Altmetric | Citations

1975

4

-

[LEARN ABOUT THESE METRICS](#)

Share | Add to | Export



Molecular
Pharmaceutics

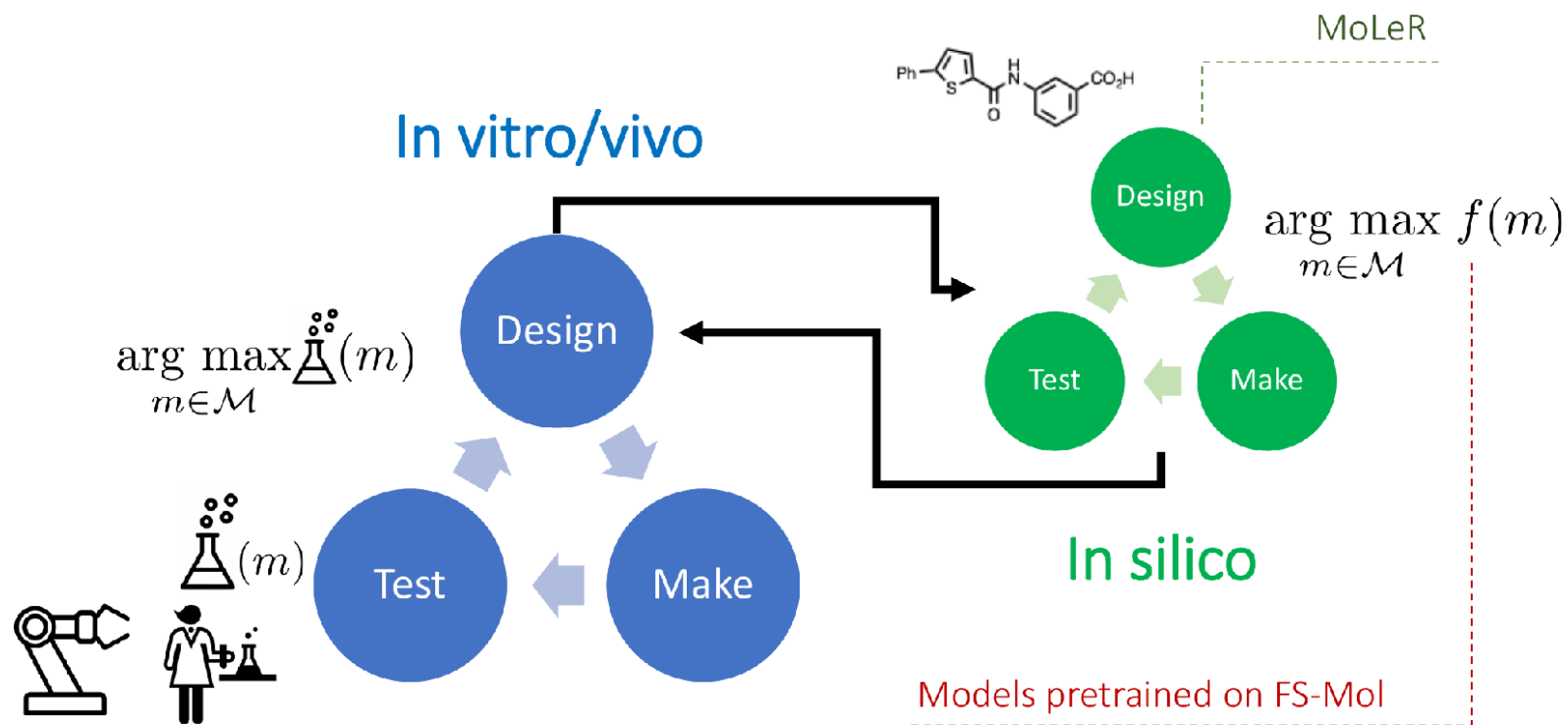
 PDF (4 MB)

 Supporting Info (3) »

SUBJECTS: Absorption, Biological databases, Molecular modeling, Molecules, Permeability



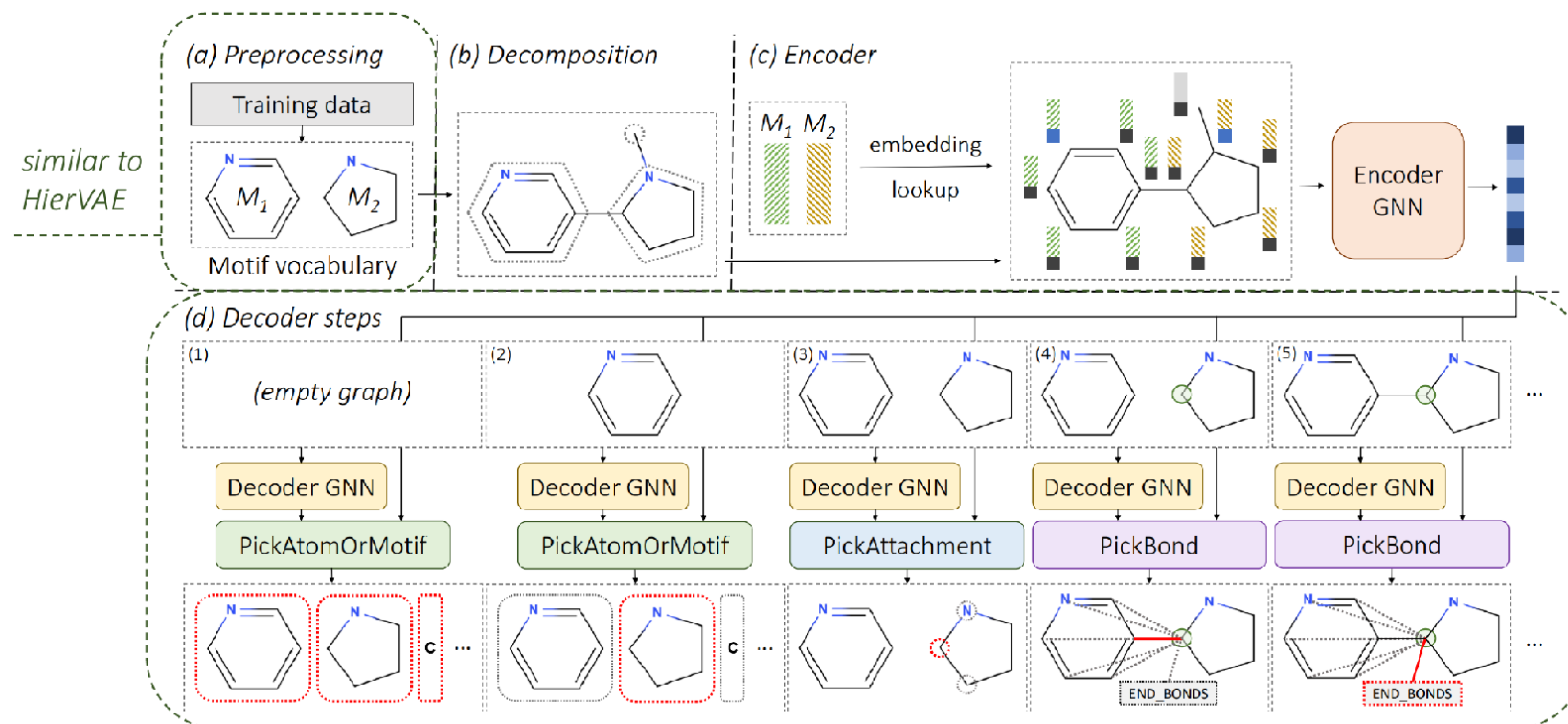
Modele generatywne



<https://github.com/kmaziarz>

<https://www.microsoft.com/en-us/research/blog/moler-creating-a-path-to-more-efficient-drug-design/>

Modele generatywne

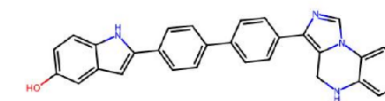
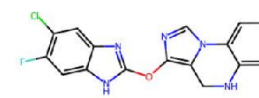
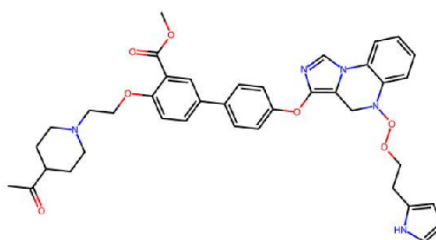
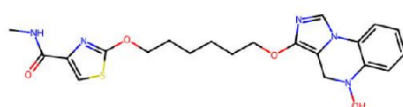
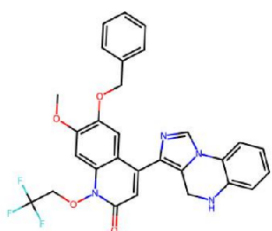
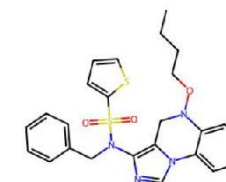
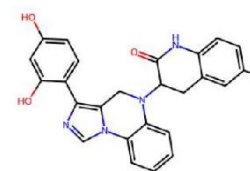
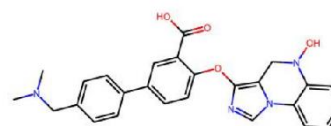
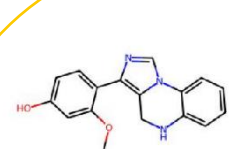
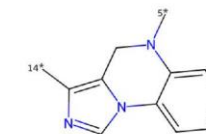


<https://github.com/kmaziarz>

decoder steps independent given encoder output → can start from scaffold

<https://www.microsoft.com/en-us/research/blog/moler-creating-a-path-to-more-efficient-drug-design/>

Modele generatywne



Wygenerowane cząsteczki na podstawie dostrojonego (fine-tuned) modelu

AI/ML → modele surogatowe

nature

Explore content ▾ About the journal ▾ Publish with us ▾ Subscribe

[nature](#) > [news](#) > article

NEWS | 14 November 2023

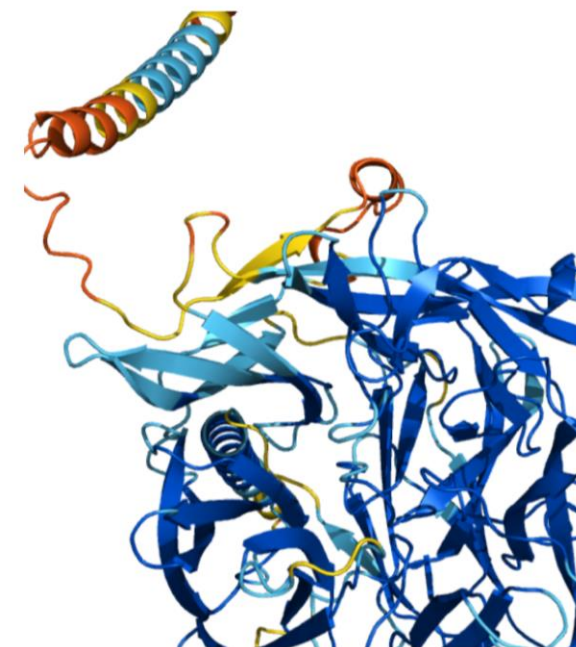
DeepMind AI accurately forecasts weather – on a desktop computer

The machine-learning model takes less than a minute to predict future weather worldwide more precisely than other approaches.

[Carissa Wong](#)

AlphaFold is an AI system developed by DeepMind that predicts a protein's 3D structure from its amino acid sequence. It regularly achieves accuracy competitive with experiment.

DeepMind and EMBL's European Bioinformatics Institute (EMBL-EBI) have partnered to create AlphaFold DB to make these predictions freely available to the scientific community. The latest database release contains over 200 million entries, providing broad coverage of UniProt (the standard repository of protein sequences and annotations). We provide individual [downloads](#) for the human proteome and for the proteomes of 47 other key organisms important in research and global health. We also provide a download for the manually curated subset of UniProt ([Swiss-Prot](#)).



Q8I3H7: May protect the malaria parasite against attack by the immune system. Mean pLDDT 85.57.

[View protein](#)

requires cookies, and the limited processing of your personal data in order to function. By using the site you are

I agree, dżmie



AI/ML → surogatowy model matematyczny

1728 pacjentów wirtualnych

$X1$ – Age [years]

$X2$ – Gender [1 = woman; 0 = man]

$X3$ – Body_mass [kg]

$X4$ – Height [cm]

$X5$ – Doses [mg]

$X6$ – Administration_time [h]

$X7$ – Infusion_duration [h]

$X8$ – PK_sample_time [h]

$X9$ – Concentration [mg/h]

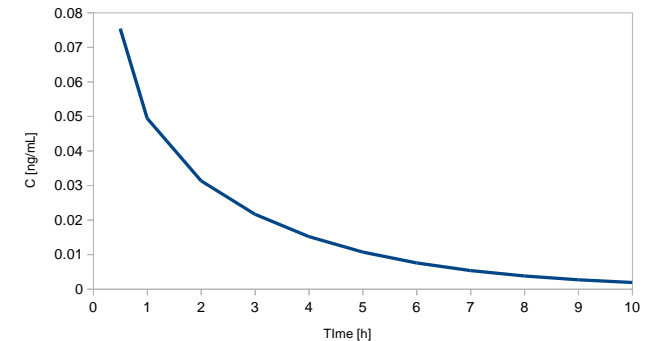
PBPK

DoE

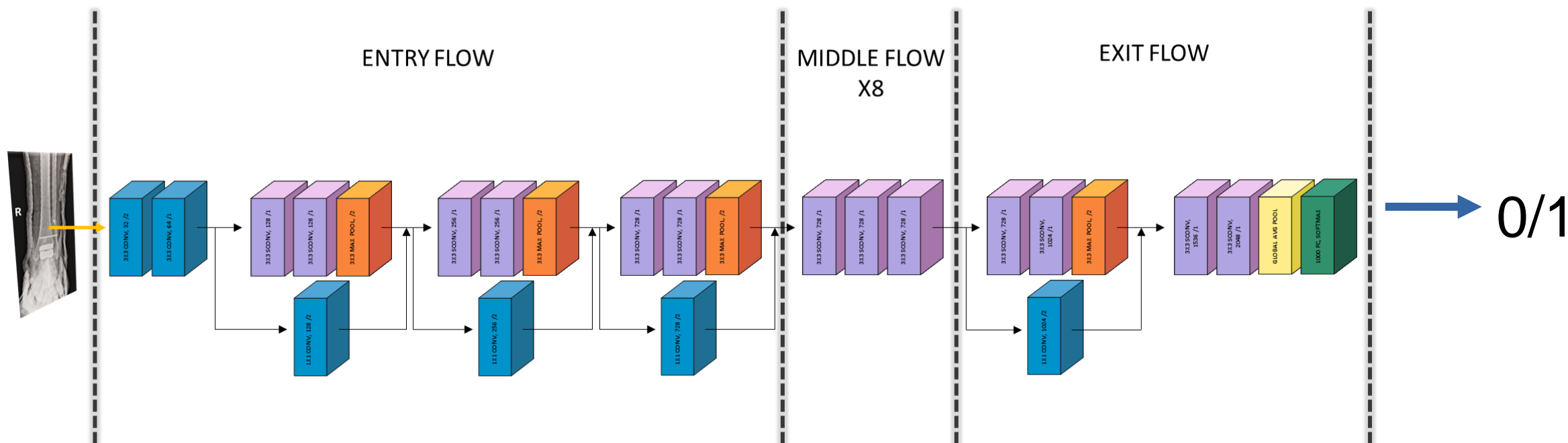
Baza danych

Symbolic Regression (dso)

$$X9 = \exp(-0.282 * X8) * \exp(\exp(X8 * (-1.78 + X2))) * (\ln(X1) * (\exp(-7.99) * X5))$$



AI/ML → analiza obrazu



Automatyzacja procesu określania poprawności projekcji zdjęć rentgenowskich stawu skokowego przy użyciu konwolucyjnych sieci neuronowych

Piotr Gabryś, Natalia Czub, Aleksander Mendyk, Grzegorz Tator

AI/ML → własne oprogramowanie

```
import numpy as np
import pandas as pd
import sys
import autokeras as ak
from configparser import ConfigParser
from sklearn.metrics import mean_squared_error, r2_score
# -----
config = ConfigParser(allow_no_value=True)
config.read('config.ini')
# -----
train_file_path = config['USERCONFIG']['train_dataset']
```

- Python
- R
- bash

AI/ML → modelowanie i optymalizacja

- postać leku i technologia wytwarzania
- QSAR/QSPR
- PK/PD
- korelacja in vitro in vivo (IVIVC / IVIVR)
- ekstrapolacja in vitro in vivo (IVIVE)
- proteomika i metabolomika
- analiza obrazu
- prace doktorskie, magisterskie, koło naukowe

modelowanie
oparte na
danych



www.cdt-card.cm-uj.krakow.pl/
www.linkedin.com/showcase/cdt-card/

Prof. dr hab. Aleksander Mendyk, aleksander.mendyk@uj.edu.pl
dr Jakub Szlęk, j.szlek@uj.edu.pl