



Automated Analysis of Structure-Multiple Property Relationships: Impact on SMARTs

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**XXX Symposium on Bioinformatics and
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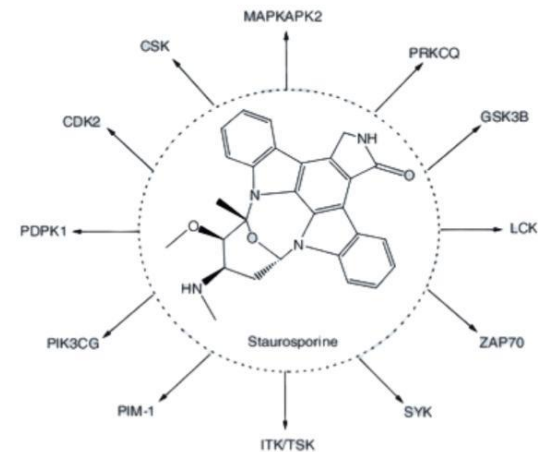
School of Chemistry, Universidad Nacional Autónoma de México

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Introduction

Structure-Activity Relationships (**SAR**) is a fundamental concept in medicinal chemistry and drug discovery. **SAR information** of compounds data sets is crucial to extract information about chemical modifications and their impact on physicochemical properties or activity

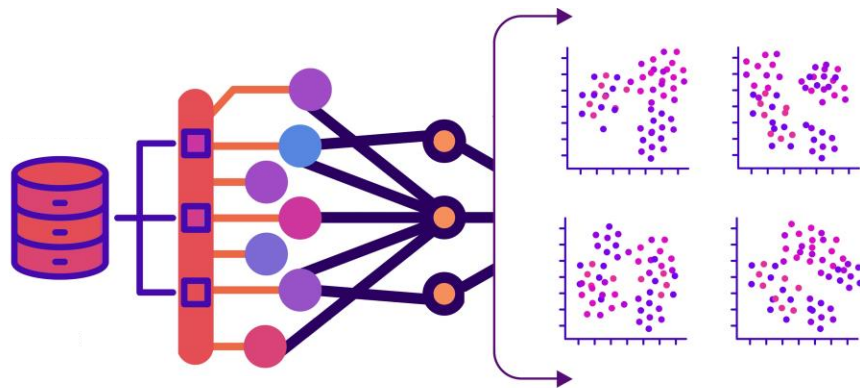
In order to increased awareness of polypharmacology a standard practice in drug discovery is explore **Structure-Multiple Activity Relationships (SMARTs)**



Reddy S. and Zhang S. (2014). *Expert Rev. Clin. Pharmacol.* 6(1), 41-47

Objective

Automate the generation of a chemical multiverse by implementing various types of descriptors to provide a global view of SMARTs.



Methods

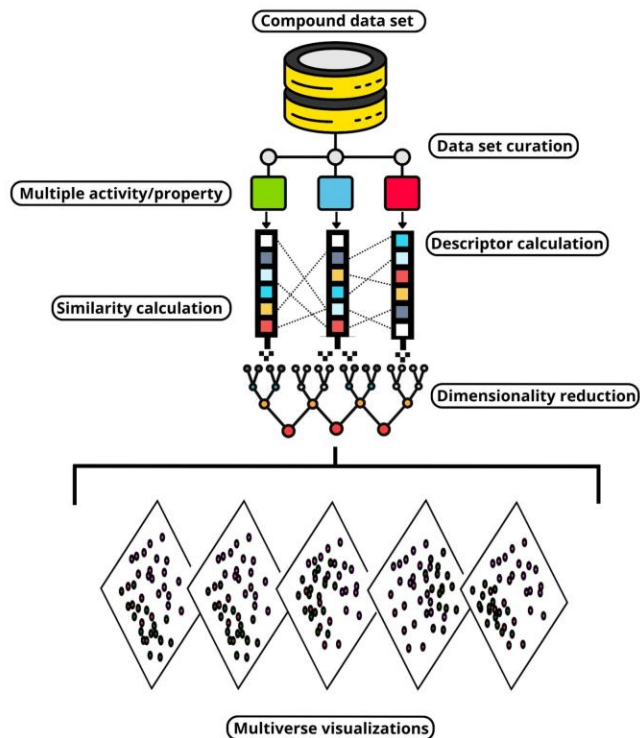
MAYA (Multiple Activity Analyzer) is developed as a user-friendly, open-source tool that automates the construction of chemical spaces by integrating 3 representations of a set of molecules described by their SMILES notation and an associated activity/property.



Workflow

Curation protocol

1. Screening of allowed elements
2. Normalization rules
3. Selection of targets fragments
4. Charge corrections
5. Ionization of strong acids
6. Selection of the most chemically reasonable tautomers
7. Elimination of repeated SMILES



Calculation descriptors

- Molecular Access System (MACCS keys) - 166-bits
- Extended Conectivity Fingerprints (ECFP 4/6) - 1024-bits
- Drug-likeness descriptors (MW, Log(P), TPSA, HBD, HBA and RB)

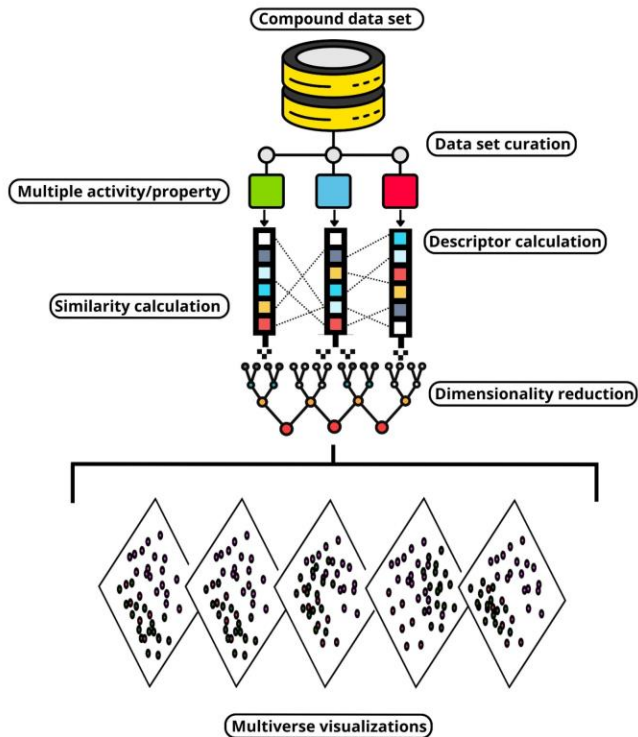


Workflow

Similarity calculations

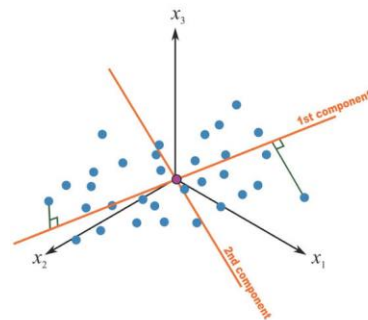
Pairwise similarity calculations are performed with the Tanimoto coefficient

$$T(a,b) = \frac{N_c}{N_a + N_b - N_c}$$



Visualization of chemical space

Principal Component Analysis (PCA) and t-Distributed Stochastic Neighbor Embedding (t-SNE) are implemented to represent the variables in a 2D dimensional space



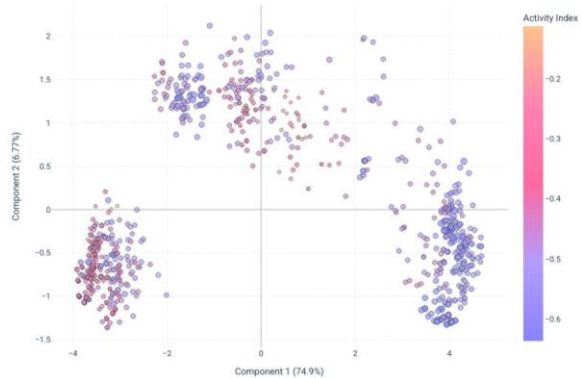
Script

MAYA is an automated application for chemical multiverse visualizations since it enables the fast generation of chemical spaces of the same data set

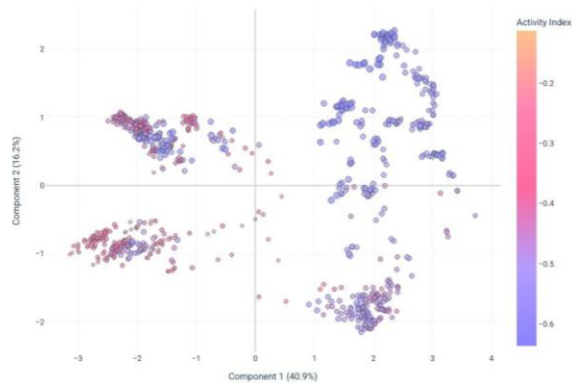


Visualizations

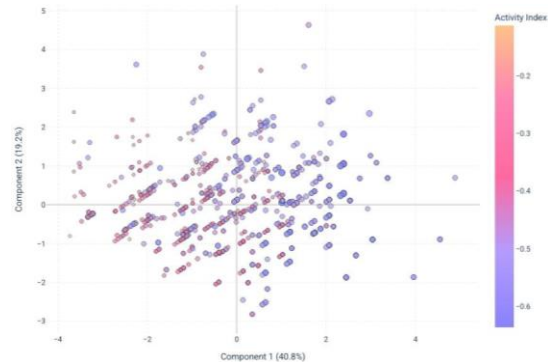
MACCS Keys



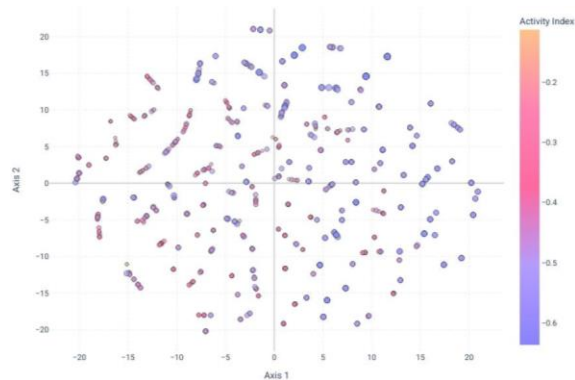
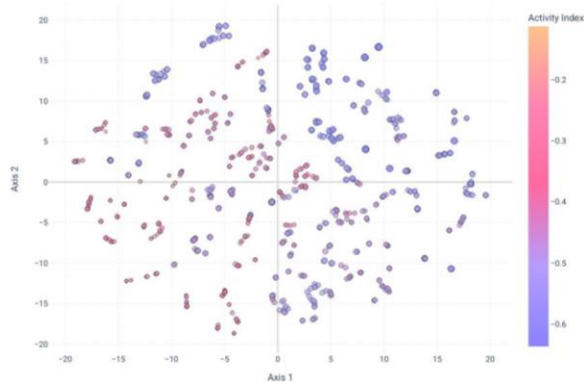
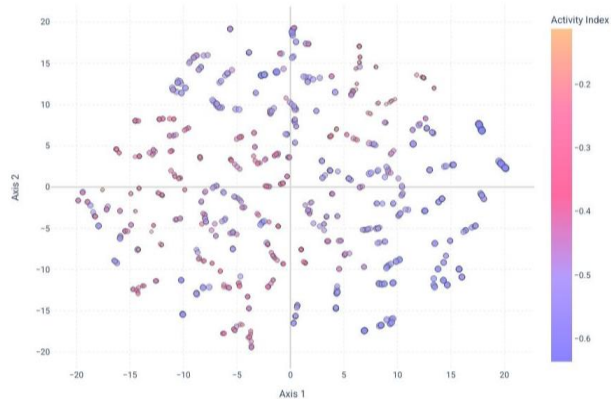
ECFP-4



Drug-likeness descriptors



T-SNE



Conclusions

- **MAYA** is an open-access tool to analyze the chemical space and chemical multiverse of compound data sets annotated with multiple biological activities. Generating a so called 'Chemical Megaverse' defined as a group of chemical spaces of the set of chemical compounds
- This approach not only facilitates data analysis and representation but also provides a **flexible platform** and transparency in research. The developed code has the potential to **accelerate** drug development and improve precision in drug repositioning.

Perspectives

- Incorporation of others types of descriptors and **implementing similarity indices** other than the Tanimoto coefficient.

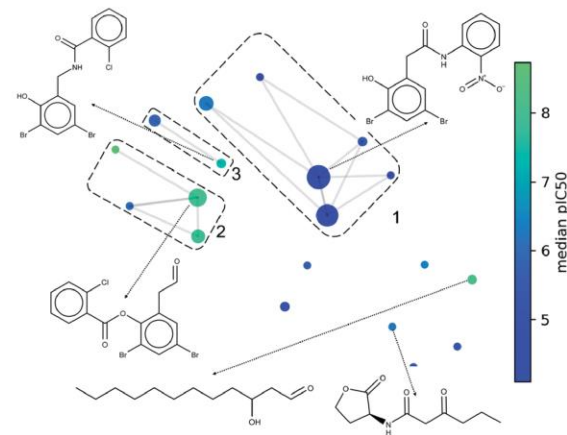
	1	2	3	4	5	
A	■	■	■	■	■	A1: 2D fingerprints
B	■	■	■	■	■	A2: 3D fingerprints
C	■	■	■	■	■	A3: Scaffolds
D	■	■	■	■	■	A4: Structural keys
E	■	■	■	■	■	A5: Physicochemistry

B1: Mechanisms of action	B2: Metabolic genes	B3: Crystals	B4: Binding	B5: HTS bioassays
C1: Small molecule roles	C2: Small molecule pathways	C3: Signaling pathways	C4: Biological processes	C5: Interactome
D1: Transcription	D2: Cancer cell lines	D3: Chemical genetics	D4: Morphology	D5: Cell bioassays
E1: Therapeutic areas	E2: Indications	E3: Side effects	E4: Diseases & toxicology	E5: Drug-drug interactions

Bertoni, M., Duran-Frigola, M., Badia-i-Mompel, P. *et al.* Bioactivity descriptors for uncharacterized chemical compounds. *Nat Commun* **12**, 3932 (2021). <https://doi.org/10.1038/s41467-021-24150-4>

- Similarly, other **data visualization techniques** could be incorporated.

Constellation plots



RSC Adv., 2022,**12**, 6783-6790



Multiple Activity Analyzer

300 years
Russian Academy
of Sciences

80 years
IBMC
Institute of Biomedical Chemistry

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Emerging Challenges and Opportunities for In Silico Drug Discovery

$C_{20}H_{26}F_2N_2O_2$

Thank you



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