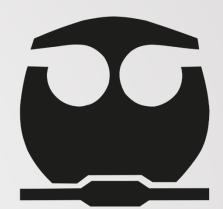


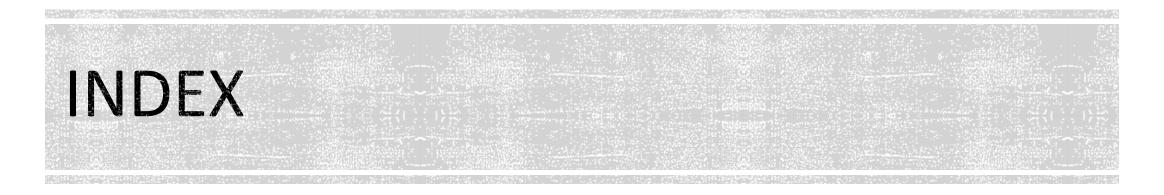
National Autonomous University of Mexico Faculty of Chemistry



**Master's and Doctoral Program in Chemical Sciences** 

### A chemical library of natural products from Latin America (LANaPDB)

<u>Tutor</u> Dr. José Luis Medina Franco <u>Student</u> Alejandro Gómez García



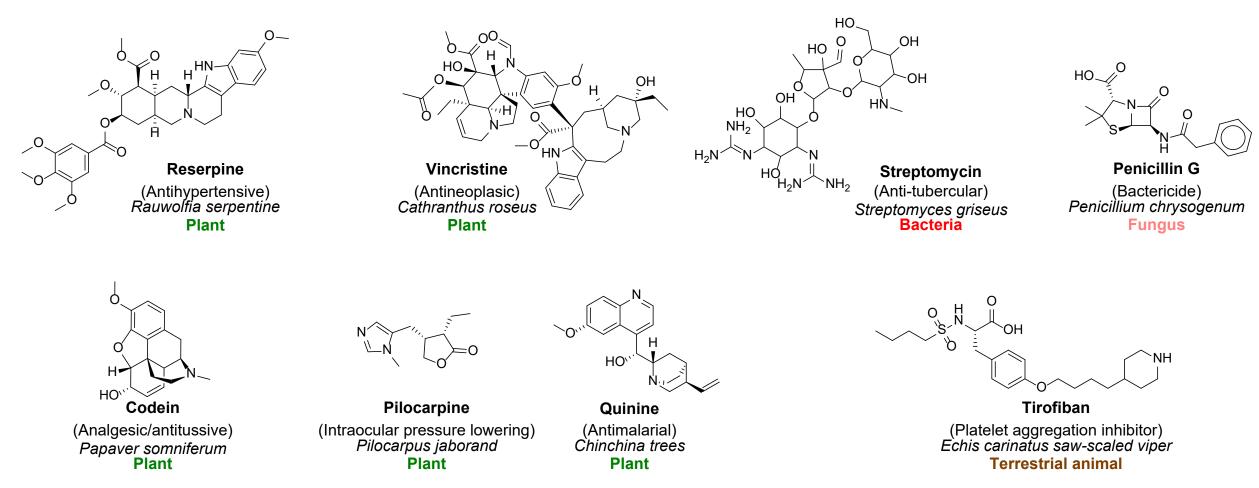
- 1. Introduction
  - > Natural products
    - > Applications in the pharmaceutical industry
  - Databases
    - > Definition, utility
    - Classification
    - > Natural products
- 2. Overview of the LANaPDB database
- 3. Progress



# NATURAL PRODUCTS

<u>Source</u>

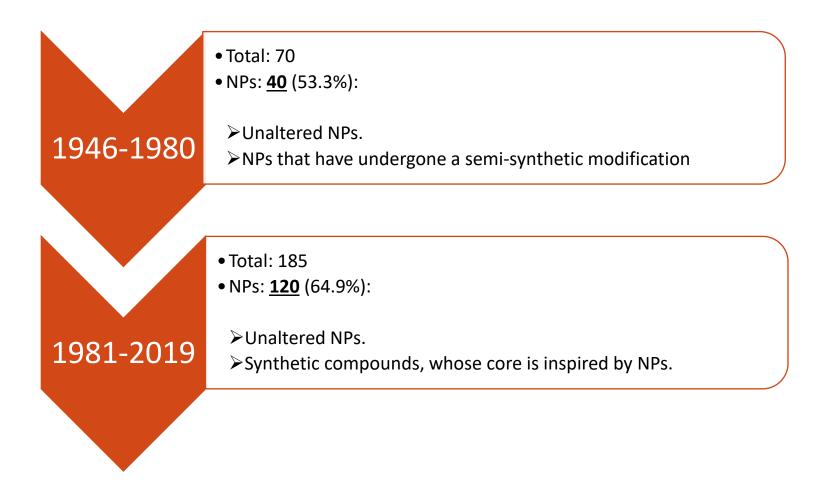
Substances produced by plants, microorganisms, and animals.





# NATURAL PRODUCTS IN THE PHARMACEUTICAL INDUSTRY

### Approved antineoplasic drugs

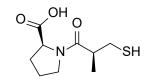


Newman-D, J. *et al*. Natural products as sources of new drugs over the nearly four decades from 01/1981 to 09/2019. *Journal of natural products*. **2020**. 83, 770–803.

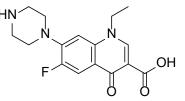


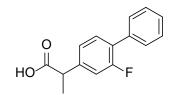
## COMPUTER-AIDED DRUG DESIGN

Between 1981 and 2019, more than **70 drugs** were approved, whose development process involved some **computational method**.



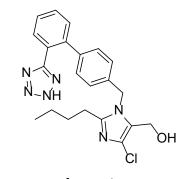
Captopril (Antihypertensive) Bothrops jararaca snake Terrestrial animal Receptor structure-based



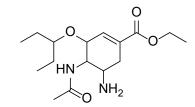


**Norfloxacin** (Antibiotic) Quantitative structure-activity relationship

Flurbiprofen (Anti-inflammatory) Molecular docking



Losartan (Antihypertensive) Receptor structure-based



Oseltamivir (Antiviral) Receptor structure-based

Sabe-T, V. *et al*. Current trends in computer aided drug design and a highlight of drugs discovered via computational techniques: A review. *European journal of medicinal chemistry.* **2021**. 224, 113705.

# DATABASES

<u>Definition</u> Organized collection of information in any field of knowledge.

> <u>Utility</u> Organize information Retrive required information



Masic, I. *et al*. Review of most important biomedical databases for searching of biomedical scientific literature. *Ultrasound in obstetrics and gynecology.* **2012**. 6, 343–361



## DATABASES IN THE CHEMISTRY AREA

Database category	Content	Database examples		
Chemical information	Chemical and crystal structures spectra Reactions and syntheses Thermophysical data	ChemSpider ChEBI Chemical Universe Database GDB		
Bioactivity	Inhibitor constant (K <sub>i</sub> ) Dissociation constant (K <sub>d</sub> ) Half maximal inhibitory concentration (IC <sub>50</sub> ) Half maximal effective concentration (EC <sub>50</sub> )	PubChem ChEMBL BindingDB ChemBank PDBbind		
Drug	Detailed drug data Comprehensive drug target information	DrugBank		
Natural product	Structures	Universal Natural Product Database MeFSAT Natural Product Atlas		
Chemical availability	Available compounds offered by chemical vendors	ZINC NCI		
Fragments	Structures Physicochemical information Binding site preferences	FDB-17 Fragment Store PADFrag		







### **C**RUGBANK



Yang, J. *et al*. Freely accessible chemical database resources of compounds for in silico drug discovery. *Current medicinal chemistry.* **2019**. 26, 7581-7597.



# REPRESENTATIVE NATURAL PRODUCT DATABASES

Database name	Number of compounds	Accessibility
Collection of Open Natural Products (COCONUT)	411,621	Open access
Universal Natural Product Database	~229,000	Open access
SuperNatural 3.0	449,048	Open access
ZINC	~80,000	Open access
Dictionary of Natural Products	~230,000	Commercial
Scifinder	~300,000	Commercial
Reaxys	~200,000	Commercial
TCM@Taiwan (China)	~58,000	Open access
IMPPAT (India)	~10,000	Open access
AfroDB (Africa)	~1000	Open access
Phyto4Health (Russia)	3128	Open access

Gómez-G, A. and Medina-F, J.L. Progress and impact of Latin American natural product databases. *Biomolecules.* **2022**. 12, 1202.



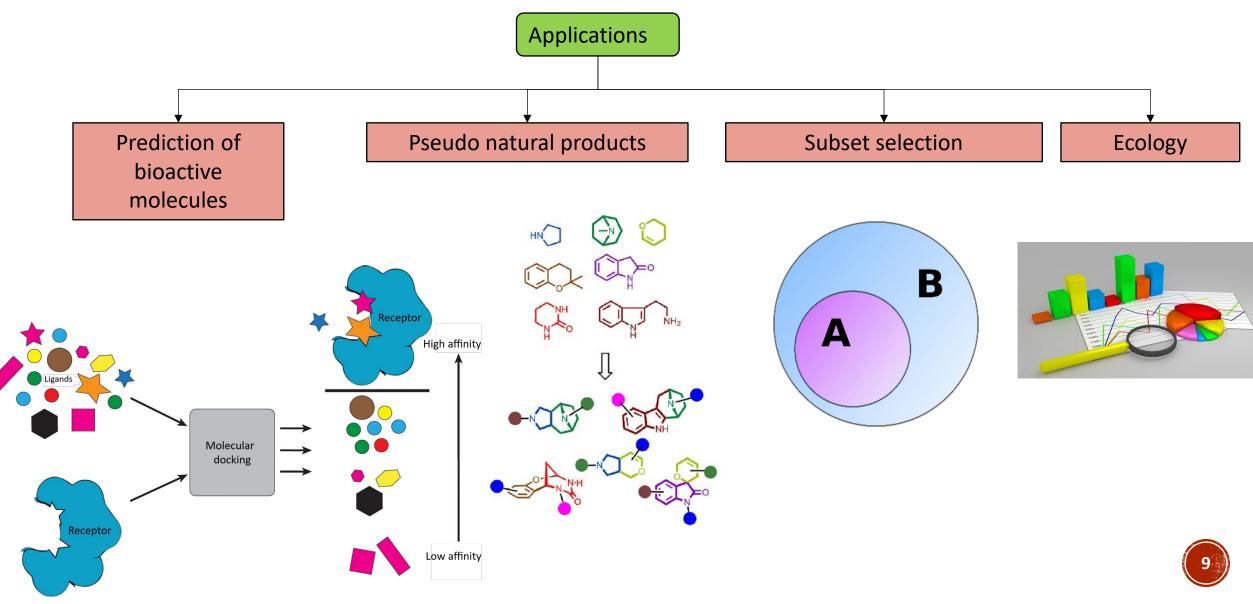
## COMMERCIAL NATURAL PRODUCTS DATABASES

Commercial databases				
Database/ Name of the company	Source of natural products			
AnalytiCon Discovery	Bacteria, terrestrial animals			
Axxam/IMAX Discovery	Bacteria, plants and fungi			
BioAustralis	Bacteria and fungi			
Biosortia Microbiomics	Bacteria and fungi			
Caithness Biotechnologies	Plants			
ChromaDex	Fungi			
Curia	Bacteria, fungi, terrestrial and marine animals			
Cyano Biotech	Cyanobacteria			
Greenpharma Natural Compound Library	Bacteria, plants, terrestrial animals			
INDOFINE Chemical Company	Plants			

The original list is made up of 25 commercial databases

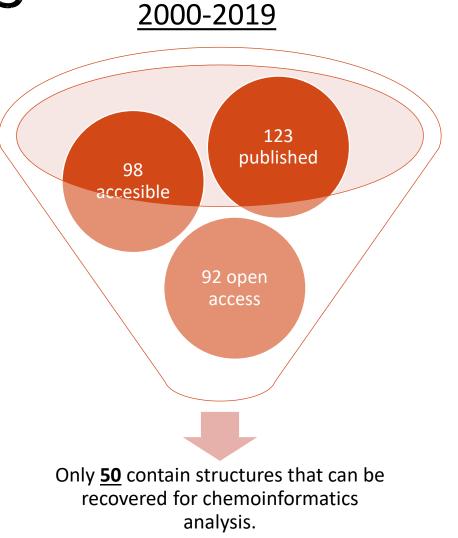
National Center for Complementary and Integrative Health https://www.nccih.nih.gov/grants/natural-product-libraries

### PRACTICAL APPLICATIONS OF NATURAL PRODUCTS DATABASES



### PUBLISHED NATURAL PRODUCTS

# DATABASES

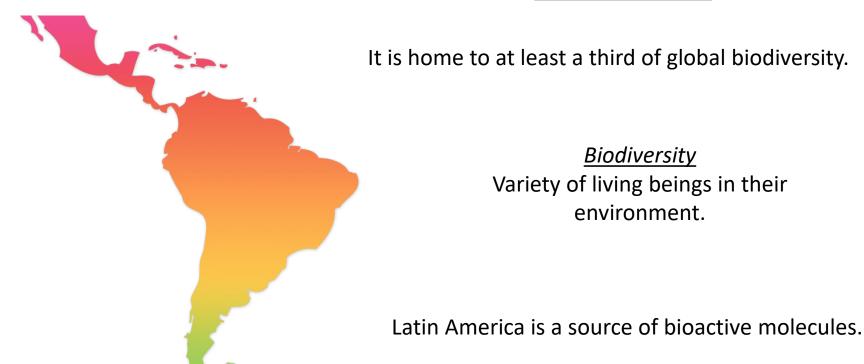


Sorokina, M. *et al.* Review on natural products databases: Where to find data in 2020. *Journal of chemoinformatics.* **2020**. 12, 20.



# DATABASES

Latin America



Raven, P.H. et al. The distribution of biodiversity richness in the tropics. Science advances. 2020. 6, 228.

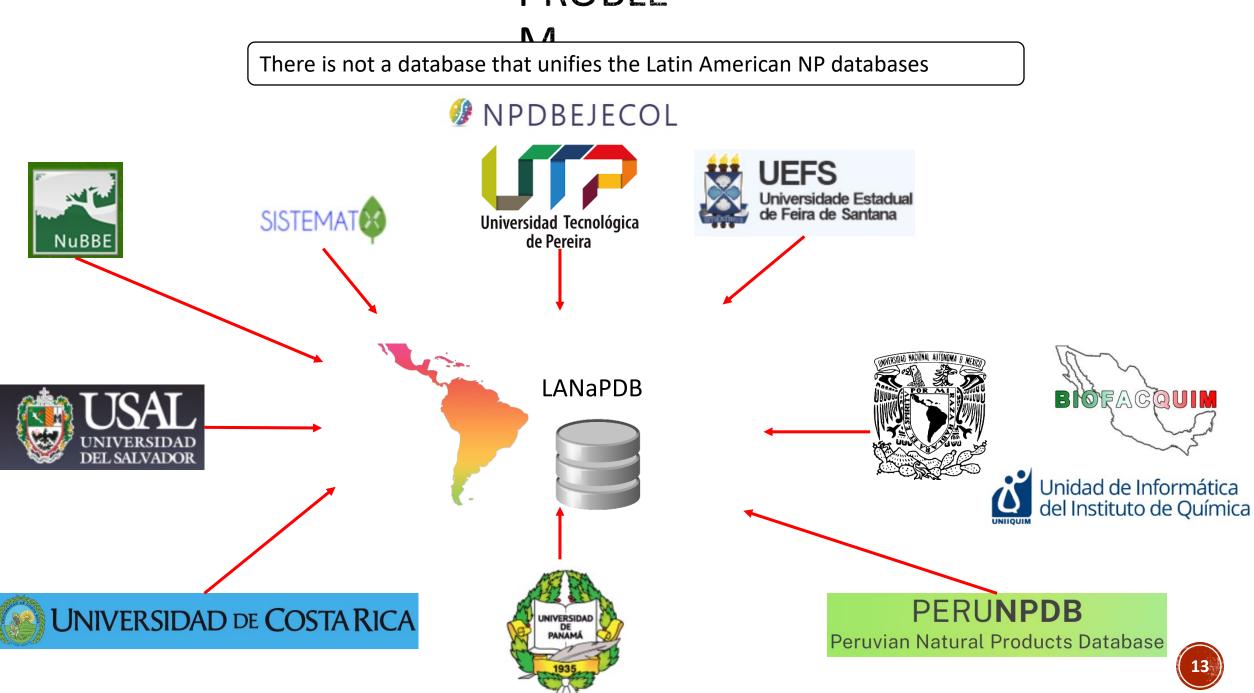


# PRACTICAL APPLICATIONS OF THE LATIN AMERICAN NP DATABASES

Database	Country	Disease or symptom	Causal agent	Number of compounds identified	Year of publication
NuBBE <sub>DB</sub>	Brazil	Chagas disease Tuberculosis	Trypanosoma cruzi Mycobacterium tuberculosis	10 13	2019 2021
SistematX	Brazil	Chagas disease Leishmaniasis Schistosomiasis Coronavirus disease 2019 Alzheimer's disease	Trypanosoma cruzi Leishmania donovani Schistosoma mansoni SARS-CoV-2 -	13 13 5 19 2	2018 2021 2022 2020 2021
UNIIQUIM	Mexico	Pain		6	2017
BIOFACQUIM	Mexico	Obesity Diabetes Hyperlipoproteinemia Cancer Human immunodeficiency virus infection Hepatitis B and C.		8	2020
		Age-related diseases		3	2021



#### PRUBLE



# OBJECTI VE

Build a database of compounds found in natural products from Latin America.

### STRATEGY

The database will be built from the **integration** and **unification** of **databases** already established or under construction.



### LATIN AMERICAN NATURAL PRODUCTS DATABASES



SISTEMA	TAR
JULIEN	
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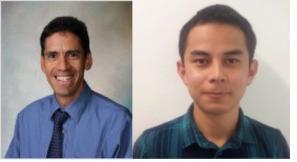




MPDBEJECOL



<b>DA</b>	ANaPI	Nomber of compounds	Country	Accessibility	Source	Year of publication	Universidad Tecnológica de Pereira
NuBB	3E <sub>DB</sub>	2223	Brazil	Open-access	Plants Microorganisms Terrestrial animals Marine animals	2013, 2017	WIVERSIDAD DE COSTA RICA
Sisten	natX	9514	Brazil	Open-access	Plants	2018, 2021	C USAL
UEFS	•	503	Brazil	Open-access	Plants	There is no associated scientific publication	UNIVERSIDAD DEL SALVADOR
NPDI	B EjeCol	236	Colombia	Open-access	Plants	2024	
NAPI	RORE-CR	359	Costa Rica	Access under request	Plants Microorganisms	Not published yet	
LAIP	NUDELSAV	214	El Salvador	Access under request		There is no associated scientific publication	1935
CIFP	MA	454	Panama	Access under request	Plants	2017	Universidade
PeruN	NPDB	280	Peru	Open-access	Plants Animales	2023	de São Paulo
UNII	QUIM	~1112	Mexico	Open-access	Plants	There is no associated scientific publication	CATÓLICA
BIOF	ACQUIM	553	Mexico	Open-access	Plants Fungi Propolis Marine animals	2019, 2020	



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io MSc. Johny Roberto Rodríguez Pérez

Dr. Dionisio Antonio Olmedo

Panamá

**CIFPMA** 

Dr. Oscar M. Mosquera Martinez

Dr. Hoover A. Valencia Sánchez

Dr. Miguel Ángel

Chávez Fumagalli

<u>Colombia</u>

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PROJECT

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<u>Brasil</u> NuBBE<sub>DB</sub>



Dra. Valeria Patricia Sülsen Dra. Soledad Ravetti

Argentina

Dra. Manuela Emilia García



# LANAPDB 2° VERSION

- Total number of compounds: 13,578
- Total number of Latin American databases in LANaPDB: 10
- Total number of Latin American countries: 7

#### **Content of the database**

Chemical structures in SMILES format

References

Commercial availability

**Biological activity** 

Synthetic feasibility

Molecular complexity

Structural classification

Physicochemical properties

Original and new IDs

Cross-references to ChEMBL and PubChem



### DATABASE CURATION

#### **Compound standardization**

Removal of explicit hydrogen atoms.

Disconnect covalent bonds between organic molecules and metals.

Removal of salts, keeping the largest fragment, which is neutralized.

Reionization (Ensures that the strongest acid is protonated first into partially ionized molecules.)

Preservation of the original stereochemistry.

Elimination of repeating molecules.



# CHEMOINFORMATICS ANALYSIS

- Structural classification
- Chemical space visualization

#### Determination of:

- Physicochemical properties
- Commercial availability
- Biological activity
- Molecular complexity
- Synthetic feasibility

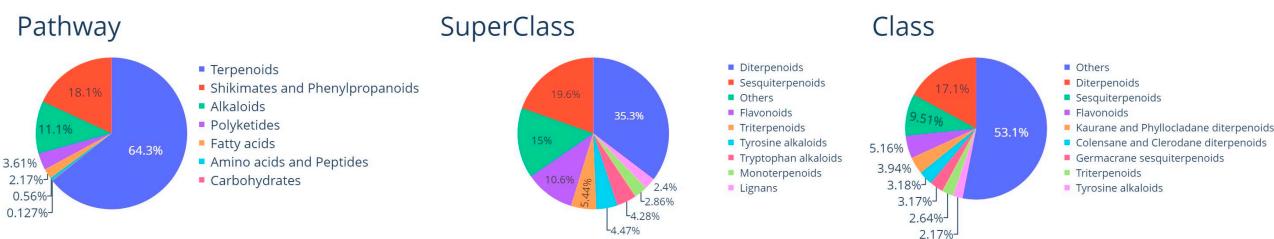


Cross-reference to:ChEMBL

PubChem



# STRUCTURAL CLASSIFt ATOM



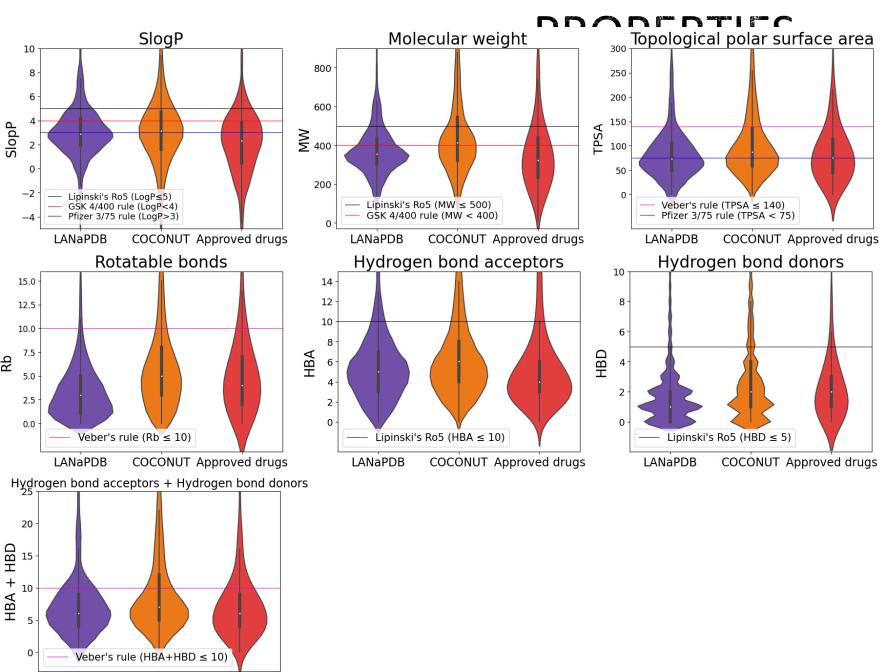
- Pathway Nature of the biosynthetic pathway.
- Superclass Chemical properties or chemotaxonomic information.
- Class Structural details

• In all 3 cases, the terpenoid compounds had the highest abundance.

Kim-H,W. *et al*. NPClassifier: A deep neural network-based structural classification tool for natural products. *J. Nat. Prod.* **2021**, 84, 2795–2807.



#### PHISICULIEIVIICAL



LANaPDB

COCONUT Approved drugs

#### <u>COCONUT</u>

One of the largest open-access natural product databases with more than 411,000 compounds.

*FDA-approved small-molecule drugs* Version 5.1.10 (released by DrugBank in January 2023)

- LANaPDB and COCONUT show a similar distribution in their physicochemical properties.
- In general, overlap the areas where the greatest number of compounds in LANaPDB and approved drugs are concentrated.

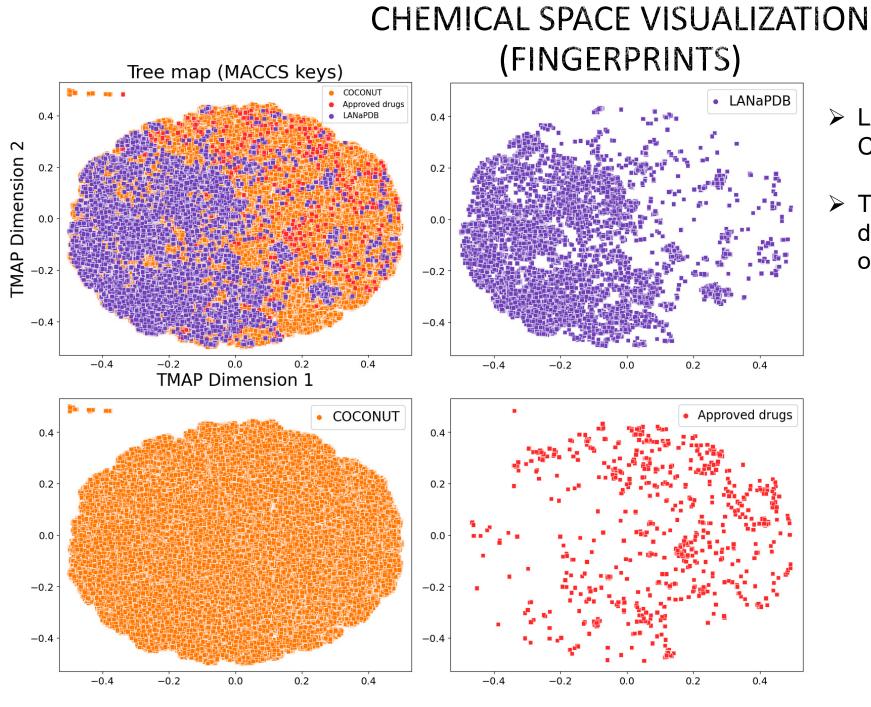


#### VISUALIZATION (PHYSICOCHEMICAL **PROPERTPIES** de Stochastic Neighbor Embedding Principal component analysis COCONUT COCONUT I ANaPDB opproved drug 2 Approved drugs Principal component t-SNE Dimension -5 -10 -15 -15 25 -20 -15 15 -20 Principal component 1 t-SNE Dimension 1 15.0 15.0 LANaPDB LANaPDB Approved drugs 12.5 12.5 10.0 10.0 7.5 5.0 2.5 -10-10 -15-15 -2.5

COCONUT (PCA and t-SNE) Approved drugs (PCA) Approved drugs (t-SNE) Totally overlaps with approved drugs and LANaPDB.

Almost totally overlap with LANaPDB.

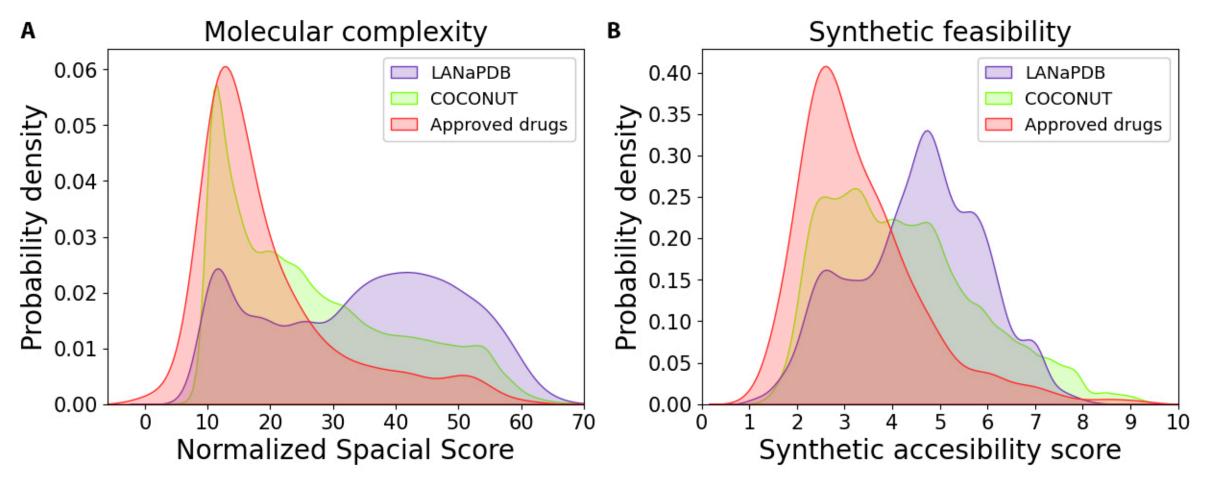
Are more dispersed, but with a high degree of overlapping to LANaPDB.



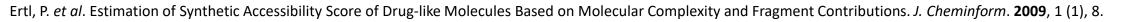
- LANaPDB totally overlaps with COCONUT.
- The approved drugs are more dispersed with a lower degree of overlapping with LANaPDB.



# MOLECULAR COMPLEXITY AND SYNTHETIC FEASIBILITY



Krzyzanowski, A. et al. Spacial Score–A Comprehensive Topological Indicator for Small-Molecule Complexity. J. Med. Chem. 2023, 66 (18), 12739–12750.



### CROSS-REFERENCE TO ChEMBL AND PubChem

ChEMBL and PubChem are two of the biggest publicly available chemical compound databases.

➢ Was made the addition of the ChEMBL and PubChem IDs to the LANaPDB compounds.

➢ 71.71% of the LANaPDB compounds have a PubChem ID.

> 23.69% of the LANaPDB compounds have a ChEMBL ID.

## COMMERCIAL AVAILABILITY

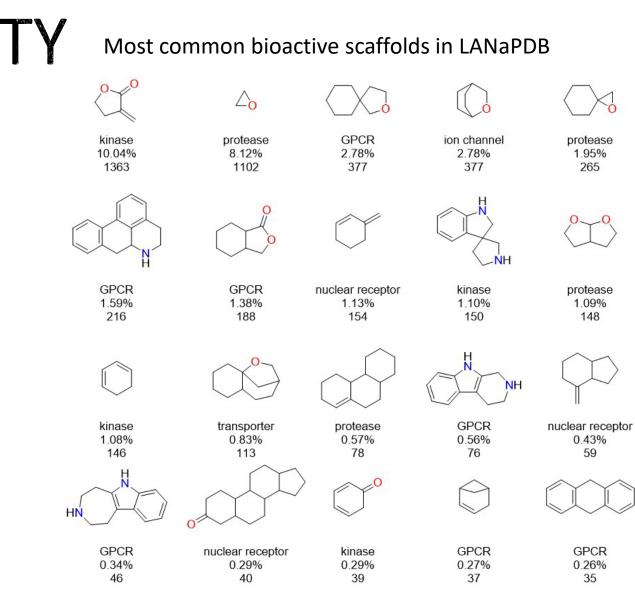
Obtained from PubChem.

> 70.5% of the LANaPDB compounds are comercial available.

➤ The information regard the available vendors for the individual compounds can be consulted in the PubChem website with the PubChem IDs already available for the LANaPDB compound.



### BIOACHVI



#### Whole molecules

- Bioactivity data obtained with the ChEMBL API from the InChIKey strings.
- 0.29% of the LANaPDB compounds have reported biological activity in the ChEMBL database.

#### Scaffolds

- Bioactivity data consulted in a paper which gathers these information from ChEMBL.
- 31.51% of the LANaPDB compounds have bioactive scaffolds.

Ertl, P. Magic Rings: Navigation in the Ring Chemical Space Guided by the Bioactive Rings. *J. Chem. Inf. Model.* **2022**, 62 (9), 2164–2170.



#### Navigating the Chemical Space and Chemical Multiverse of a Unified Latin American Natural Product Database: LANaPDB

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Abstract: The number of databases of natural products (NPs) has increased substantially. Latin

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check for updates

D.A.A.; Zamora, W.J.;

Barazorda-Ccahuana, H.L.;

Citation: Gómez-García, A.; Jiménez,

Chávez-Fumagalli, M.Á.; Valli, M.;

Andricopulo, A.D.; Bolzani, V.d.S.;

Navigating the Chemical Space and

Database: LANaPDB. Pharmaceuticals

Chemical Multiverse of a Unified

Latin American Natural Product

2023, 16, 1388. https://doi.org/

10.3390/ph16101388

Olmedo, D.A.; Solís, P.N.; et al.

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America is extraordinarily rich in biodiversity, enabling the identification of novel NPs, which has encouraged both the development of databases and the implementation of those that are being created or are under development. In a collective effort from several Latin American countries, herein we introduce the first version of the Latin American Natural Products Database (LANAPDB), a public compound collection that gathers the chemical information of NPs contained in diverse databases from this geographical region. The current version of LANAPDB unifies the information from six countries and contains 12,959 chemical structures. The structural classification showed that the most abundant compounds are the terpenoids (63.2%), phenylpropanoids (18%) and alkaloids (11.8%). From the analysis of the distribution of properties of pharmaceutical interest, it was observed that many LANAPDB compounds satisfy some drug-like rules of thumb for physicochemical properties. The concept of the chemical multiverse was employed to generate multiple chemical spaces from two different fingerprints and two dimensionality reduction techniques. Comparing LANAPDB with FDA-approved drugs and the major open-access repository of NPs, COCONUT, it was concluded that the chemical space covered by LANAPDB completely overlaps with COCONUT and, in some



### Latin American Natural Product Database (LANaPDB): an update

27 August 2024, Version 1



MDPI

<u>Alejandro Gómez-García</u> (b), <u>Daniel A. Acuña Jiménez</u>, <u>William J. Zamora</u> (b), <u>Haruna L. Barazorda-Ccahuana</u>, <u>Miguel Á. Chávez-Fumagalli</u>, <u>Marilia Valli</u>, <u>Adriano D. Andricopulo</u>, <u>Vanderlan da S. Bolzani</u> (b), <u>Dionisio A. Olmedo</u>, <u>Pablo N. Solís</u>, <u>Marvin J. Núñez</u> (b), <u>Johny R. Rodríguez Pérez</u> (b), <u>Hoover A. Valencia Sánchez</u>, Héctor F. Cortés Hernández, Oscar M. Mosquera Martinez, Jose L. Medina-Franco (b)

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#### Abstract

Natural product (NP) databases are crucial tools in computer-aided drug design (CADD). Over the last decade, there has been a worldwide effort to assemble information regarding natural products (NPs) isolated and characterized in certain geographical regions. In 2023, it was published LANaPDB, to our knowledge, it is the first attempt to gather and standardize all the NP databases of Latin America. Herein, we present and analyze in detail the contents of an updated version of LANaPDB, which includes 619 newly added compounds from Colombia, Costa Rica, and Mexico. The present version of LANaPDB has a total of 13,578 compounds, coming from ten databases of seven Latin American countries. A chemoinformatic characterization of LANAPDB was carried out, which includes the structural classification of the compounds, calculation of six physicochemical properties of pharmaceutical interest, visualization of the chemical space, determination of the structural diversity, molecular complexity, synthetic feasibility, commercial availability, predicted and reported biological activity. In addition, the LANaPDB compounds were cross-referenced to two of the largest public chemical compound databases annotated with biological activity: ChEMBL and PubChem. The Latin American natural product collection LANaPDB is publicly available and can be downloaded at https://github.com/alexgoga21/LANaPDB-version-2/tree/main.

#### Keywords

chemoinformatics	chemical space	database	diversity	drug discovery	Latin America
open science					



Received: 8 February 2024 Revised: 3 April 2024 Accepted: 13 April 2024 DOI: 10.1002/minf.202400052

#### RESEARCH ARTICLE

#### Updating and profiling the natural product-likeness of Latin American compound libraries

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Biodiversity and Drug Discovery

Abstract

Compound databases of natural products play a crucial role in drug discovery and development projects and have implications in other areas, such as food chemical research, ecology and metabolomics. Recently, we put together the first version of the Latin American Natural Product database (LANaPDB) as a collective effort of researchers from six countries to ensemble a public and representative library of natural products in a geographical region with a large biodiversity. The present work aims to conduct a comparative and extensive profiling of the natural product-likeness of an updated version of LA-NaPDB and the individual ten compound databases that form part of LA-NaPDB. The natural product-likeness profile of the Latin American compound databases is contrasted with the profile of other major natural product databases in the public domain and a set of small-molecule drugs approved for clinical use. As part of the extensive characterization, we employed several chemoinformatics metrics of natural product likeness. The results of this study will capture the attention of the global community engaged in natural product databases, not only in Latin America but across the world.

#### KEYWORDS

chemical space, chemoinformatics, databases, LANaPDB, natural products

COCONUT, Collection of Open Natural Products; FDA, Food and Drug Administration; HTS, high throughput screening; KDE, kernel density estimate; LANaPDB, Latin American Natural Product Database; ML, machine learning; NP, natural product; NPs, natural products; N3PL, neural networks natural product-likeness; NPLC, natural product-likeness calculator; SM, synthetic molecule; SMs, synthetic molecules.

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#### Progress and Impact of Latin American Natural **Product Databases**

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Abstract: Natural products (NPs) are a rich source of structurally novel molecules, and the chemical space they encompass is far from being fully explored. Over history, NPs have represented a significant source of bioactive molecules and have served as a source of inspiration for developing many drugs on the market. On the other hand, computer-aided drug design (CADD) has contributed to drug discovery research, mitigating costs and time. In this sense, compound databases represent a fundamental element of CADD. This work reviews the progress toward developing compound databases of natural origin, and it surveys computational methods, emphasizing chemoinformatic approaches to profile natural product databases. Furthermore, it reviews the present state of the art in developing Latin American NP databases and their practical applications to the drug discovery area.

Keywords: chemoinformatics; compound databases; chemical space; diversity; drug discovery; open science; pseudo-natural product

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#### 1. Introduction

Natural products (NPs) are a major source of bioactive molecules, and their importance is invaluable [1]. Between 1981 and 2014, over 50% of newly developed drugs were developed from NPs [2]. Over nearly four decades, they have been a significant resource of bioactive compounds for medicinal chemistry [3]. There are several sources for bioactive molecules, which include marine [4,5], fungal [6,7], bacteria [8], and plants [9]. Endogenous substances produced by humans and animals are another vital source of bioactive compounds [10]. Venoms and poisons produced by different animals are other rich sources [11].

Currently, there is an effort to find bioactive compounds from NPs as starting points for the further development of drug candidates for infectious diseases: antibacterial [12], antiprotozoal [13], antifungal [14], and antiviral [15]. Additionally, NPs are currently employed in medicinal chemistry to develop new chemotherapies, for example, neurodegenerative [16], cancer [17], immune-related [18], liver [19], and kidney [20] diseases, to mention a few examples. Moreover, during the current pandemic outbreak, NPs have been a rich source for discovering potential lead compounds against severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2) [21,22].

Figure 1 shows the chemical structures of representative NPs approved for clinical use. The figure shows the pharmacological effect and the source of the compound. With the exception of captopril, all compounds were approved for clinical use without modifying the original chemical structure of the compound found in the extraction source. Captopril was developed based on the bradykinin potentiating factor in Bothrops jararaca snake venom. In 1981, it was the first animal toxin-based drug approved for human use. [23,24]. Digoxin is obtained from the plants of the genus Digitalis [25].

MDPI

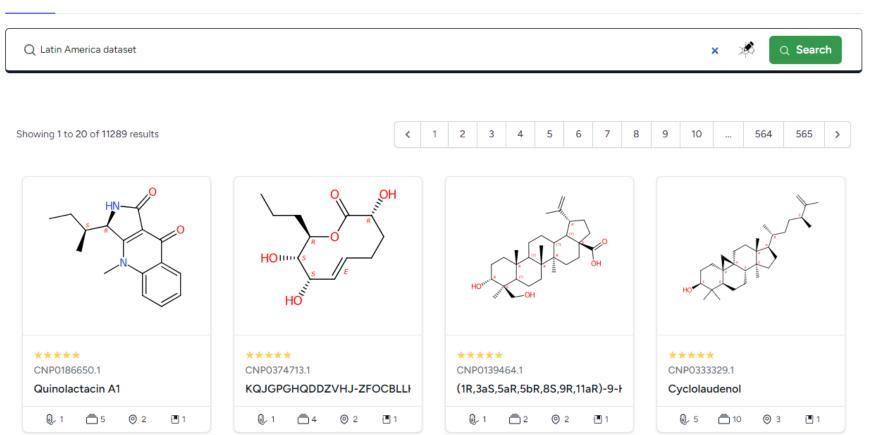


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#### #COLLECTION Latin America dataset

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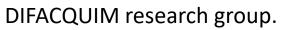
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# SUPPORTING SLIDES



# SYNTHETIC ACCESSIBILITY SCORE

<u>Training dataset</u> 1 million PubChem molecules

### SAscore = fragmentScore - complexityPenalty

**FragmentScore** 

- The contribution of each fragment.
- The most common fragments in PubChem have a higher contribution, which is positive.
- Less common fragments in PubChem have a negative contribution.

**ComplexityPenalty** 

- It characterizes the presence of complex structural features.
- Take into account:
  - 1. Complexity of the ring system.
  - 2. Number of stereogenic centers.
  - 3. Presence of macrocycles (ring of 12 or more atoms) and size.



# NORMALIZED SPACIAL a=Number of heavy atoms.

h=Atom hybridization h=3 sp<sup>3</sup> h=2 sp<sup>2</sup> h=1 sp

*h*=4 other hybridization

s=Stereogenicity

*s*=2 Atoms involved in *E* or *Z* isomers *s*=1 Any other case

*r*=Ring term

*r*=2 Atoms of a non-aromatic ring.*r*=1 Atoms of an aromatic ring or linear structure.

*n*=Number of heavy atom neighbors

The branching of the molecular skeleton is accounted for by squaring the *n* term.

 $nSPS = \frac{1}{a} \sum_{i} h_i s_i r_i n_i^2$