

METLIN MS² molecular standards database: a broad chemical and biological resource

To the Editor — Tandem mass spectrometry (MS²) data provide high-confidence molecular identification of known molecules and preliminary characterization of novel, unknown molecules (unknowns). However, for databases to be an effective resource, broad chemical space coverage is necessary. Consequently, we have created METLIN (<http://metlin.scripps.edu>) a highly annotated and structurally diverse database of over 850,000 molecular standards. METLIN's tandem mass spectral library numerically covers almost 1% of PubChem's 93 million compounds, essentially a number that can be characterized as the known chemical space.

The utility of MS² data acquisition is especially advantageous when coupled with liquid chromatography–mass spectrometry (LC–MS) analysis of complex samples^{1,2}. Such datasets typically have tens of thousands of features³, and while accurate single-stage MS measurements of precursor molecular ions can provide putative identifications, these measurements alone are not sufficient to structurally characterize the number of compounds having identical or similar molecular weights. Therefore, characterizing every feature in an LC–MS dataset is challenging and currently not possible. However, implementation of MS² provides structural information that greatly increases the confidence of molecular identifications². The recent expansion of

the METLIN MS² database of molecular standards offers an opportunity to quantify this improved confidence (Fig. 1). METLIN now hosts over 850,000 molecular standards with MS² data generated in both positive and negative ionization modes at multiple collision energies, collectively containing over 4,000,000 curated high-resolution tandem mass spectra. Thus, the size of METLIN makes molecular annotation and identification more feasible. In comparison, the National Institute of Standards and Technology (NIST) MS² database, the next largest molecular standards database, contains 15,000 standards (Fig. 1a).

The combination of METLIN's molecular standards and systematically acquired experimental data allows for the examination of the impact that MS² data has on the identification of known molecules. For example, when METLIN is searched against precursor *m/z* values at varying parts per million (ppm) errors, the number of hits typically ranges from tens to hundreds of compounds. However, with the addition of MS² data, the false positive rate can be minimized to only a few compounds. Beyond providing molecular identification through its multiple search capabilities (for example, MS², batch, name and elemental composition), METLIN's expansion will facilitate similarity searching. The similarity searching algorithm was originally

developed to aid in the identification of unknowns and the discovery of novel molecules⁴ and operates by using fragment ion data to help align an unknown molecule to compounds with similar fragmentation data within a database to help further identify and characterize it⁴. METLIN's fragment ion similarity searching and neutral loss similarity searching are applied in identifying endogenous metabolites, drugs and drug metabolites, as well as biotransformation products of xenobiotics⁵. METLIN facilitates both endogenous and exogenous compound identification. For example, it contains MS² data for over 60,000 pyrimidine analogs and over 6,000 purine analogs (Fig. 1b), among others.

The expanded METLIN database will enable new types of analyses. First, we expect that a MS² database of this size can substantially reduce the magnitude of false positives that molecular identification based solely on molecular ion values can generate. Second, while very high accuracy MS² data are useful, they do not substantially enhance identification confidence. Therefore, low-resolution instrumentation can be more broadly used for relatively sophisticated experiments by chemists and biologists who do not have access to high-end equipment⁶. And finally, METLIN can be applied for identification of unknown compounds via fragment ion and neutral loss similarity

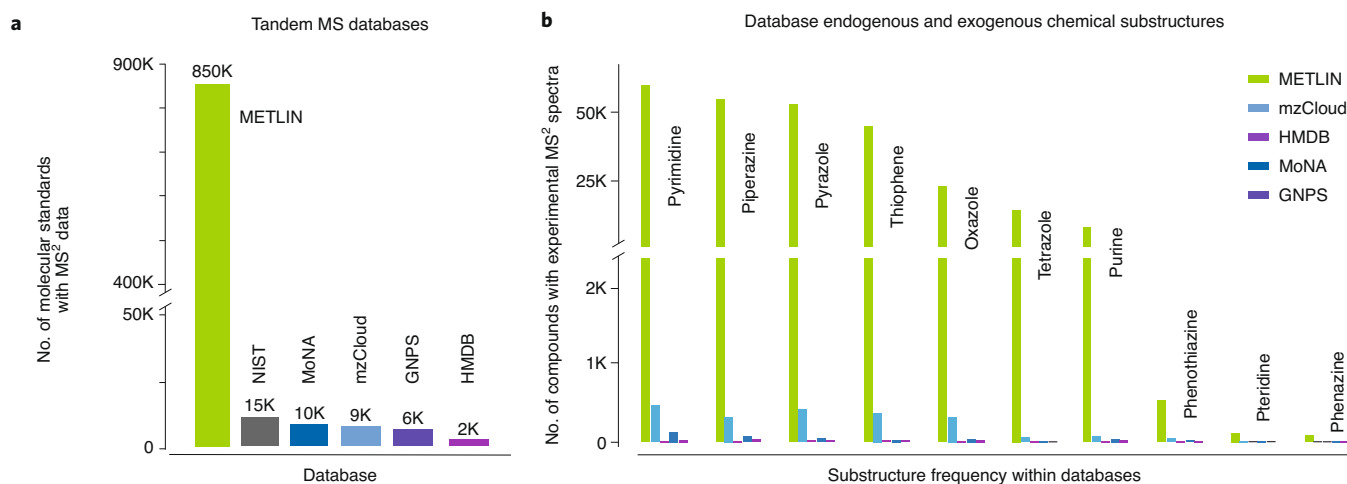


Fig. 1 | The METLIN MS² database. **a**, Comparison of databases containing MS² data from molecular standards⁹¹⁰. **b**, MS² database comparison of commonly observed endogenous substructures and drug scaffolds.

searching. For example, synthetic chemists can apply METLIN to the structural elucidation of unexpected products, while biochemists can use it to identify the plethora of bacterial and human metabolites in microbiome and exposome studies, and it has unexplored potential in the chemical, toxicological and pharmaceutical sciences^{7,8}.

Data availability

The data in the METLIN database are available at <http://metlin.scripps.edu>. The data in other databases mentioned in this study were obtained from their websites (accessed in February 2020) or published papers: MoNA (<https://mona.fiehnlab.ucdavis.edu/>), mzCloud (<https://www.mzcloud.org/>), GNPS (<https://gnps.ucsd.edu/>)⁹, HMDB (<https://hmdb.ca/>)¹⁰ and NIST 17 (<https://chemdata.nist.gov/>). □

Editorial note: This article has been peer reviewed.

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Competing interests

The authors declare no competing interests.

Additional information

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