# MS\_Piano: A Software Tool for Annotating Peaks in CID Tandem Mass Spectra of Peptides and N-Glycopeptides

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Cite This: http	os://doi.org/10.1021/acs.jproteom	e.1c00324	Read Online			
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ABSTRACT: Annotating product ion peaks in tandem mass spectra is essential for evaluating spectral quality and validating pentide identification. This task is more complex						

evaluating spectral quality and validating peptide identification. This task is more complex for glycopeptides and is crucial for the confident determination of glycosylation sites in glycoproteins. MS\_Piano (<u>Mass Spectrum Peptide Annotation</u>) software was developed for reliable annotation of peaks in collision induced dissociation (CID) tandem mass spectra of peptides or N-glycopeptides for given peptide sequences, charge states, and optional modifications. The program annotates each peak in high or low resolution spectra with possible product ion(s) and the mass difference between the measured and theoretical m/zvalues. Spectral quality is measured by two major parameters: the ratio between the sum of unannotated vs all peak intensities in the top 20 peaks, and the intensity of the highest



unannotated peak. The product ions of peptides, glycans, and glycopeptides in spectra are labeled in different class-type colors to facilitate interpretation. MS\_Piano assists validating peptide and N-glycopeptide identification from database and library searches and provides quality control and optimizes search reliability in custom developed peptide mass spectral libraries. The software is freely available in .exe and .dll formats for the Windows operating system.

**KEYWORDS:** peak annotation, peptide fragmentation, glycopeptide fragmentation, proteomics, glycoproteomics, mass spectrometry, software, peptide identification, glycopeptide identification

# INTRODUCTION

Tandem high and low resolution mass spectrometry have become routine for identifying peptides, their modifications, and precursor proteins in proteomic studies.<sup>1–4</sup> This technique is also used to identify glycosylation sites in glycoproteins in complex biological samples.<sup>5,6</sup> Two principal means of identifying peptides and glycopeptides in bottom-up proteomic studies are by searching protein sequence databases<sup>7–10,34–36</sup> and mass spectral libraries.<sup>11–15</sup> Combining these methods can enhance results.<sup>16</sup> However, sometimes high scoring spectra have unassigned ions due to contamination or incorrect identification. This is especially true for data collected from highly complex protein digests containing thousands of spectra, each of which may contain peaks from cofragmentation of ions present in m/z fragmentation windows. In such cases, annotating peaks in mass spectra with reliable characterized product ions can provide additional confidence of correct and context-consistent identification. This is particularly useful for library searching, where spectral quality can be ensured by identifying the origin of all peaks in each library spectrum prior to its use as a reliable reference. Prior annotation enables users to quickly understand the significance of any differences in query and library spectra.

Software tools for automatically annotating product ion peaks in tandem mass spectra have been limited and few software tools have been reported. One of these is an online tool, MS-Product.<sup>17</sup> Such programs usually provide useful predicted fragmentation ions, but do not annotate experimental spectra, verify identification correctness, or evaluate spectrum quality. They require users to manually match the theoretical m/z values with the experimental ones or write additional programs for implementing this match. Other studies have noted commonly encountered product ions,<sup>18,19</sup> but these are not available in currently used software. Several software programs are available (e.g., free software PDV,<sup>30</sup> TOPPView,<sup>31</sup> and the commercial software Proteome Discoverer<sup>32</sup>) as spectral visualization tools, but these do not provide glycopeptide product ion annotation.

Here, we present our newly developed software tool,  $MS_Piano$  (<u>Mass Spectrum Peptide Anno</u>tation), that rapidly annotates peaks in tandem mass spectra of both peptides and N-glycopeptides with product ions based on peptide sequence, charge state, and modifications using a variety of rules developed to minimize errors. This software also provides a measure of spectral quality to evaluate the validity of

Received: April 19, 2021





Figure 1. Varieties of product ions and fragments used in MS\_Piano (c, x, and z ions are not used for annotating CID mass spectra).

identifications. It is easy to use for proteomic and glycoproteomic data analysis and freely available as a Windows application in both .exe and .dll formats.

## SOFTWARE FEATURES

MS\_Piano annotates peaks in a tandem high or low resolution mass spectrum of a peptide or N-glycopeptide based on a presumed sequence, charge state, and optional modifications.

# **Peptide Annotation**

Peaks in a tandem mass spectrum are annotated with precursor (p), product ion y, b, a, immonium ions,<sup>18</sup> internal fragment ions, neutral losses or gains from the precursor and product ions, as well as their isotopic ions. A peak is not labeled as an internal fragment if it is assigned with any of the above ions for simplicity, and to avoid internal fragment complexity. MS\_Piano follows common peptide fragmentation and product ion nomenclature<sup>28,29</sup> and excludes c, x, and z ions for annotating collision induced dissociation (CID) spectra. Product ion annotations and examples are shown in Figure 1. The software provides more than 100 built-in modifications and used more than 800 modifications from unimod.<sup>20</sup> Users can add their own modifications in a separate file "mod added.txt". Detailed information on name, formula, and amino acid residues of all the built-in modifications, immonium and fragment ions, neutral losses and gains, iTRAQ (isobaric tags for relative and absolute quantitation) and TMT (Tandem Mass Tag) fragments are provided in the Supporting Information (Table S1-S5).

For each peptide's sequence, charge state and optional modifications, MS\_Piano uses the example format in Figure 2.

An example of an annotated high-resolution mass spectrum in Figure 3 shows that MS\_Piano annotates not only y, b, immonium, and internal fragment ions, but also iTRAQ and its



**Figure 2.** An example format for a peptide sequence, charge state, and optional modifications.

reporters, the neutral losses of b, y, and internal fragments. Two examples of low-resolution ion trap mass spectra annotated with MS\_Piano are shown in Figure S1 in the Supporting Information.

### **Glycopeptide Annotation**

We extended MS\_Piano to annotate peaks of CID tandem mass spectra of N-glycopeptides. We use 6 common monosaccharides found in mammals as basic units for glycan composition (Table 1). These short symbols enable their compact representation on computer screens. We also use "G": to distinguish glycosylation from other peptide modifications. For example, in Figure 4, YHYNGTLLDGTLFDSSYSR/ $3_2(0,Y,TMT)(3,N,G:G2H9)$ ,  $G_2H_9$  is the glycan on amino acid Asparagine (N) at location 3 counting from N-terminus starting from 0.

In addition to the above-described product ions and fragments for peptide annotation, the following 3 product ion types were added for N-glycopeptide annotation:

- 1. Peptides: Product ions y', b', and a' ions are y, b, and a ions that have lost N-glycosylation, respectively. These ions plus various sugars are also used for annotation. For example, in Figure 4,  $b'_4$  is  $b_4$  ion without glycan  $G_2H_9$ , and  $b'_4+G$  is  $b'_4$  with a G modification.
- 2. Glycans: Glycans and those with various losses; e.g., G, G-H<sub>2</sub>O, G-2H<sub>2</sub>O in Figure 4 and GHS in Figure 6.
- 3. Glycopeptides: Peptide sequence with various glycans. For brevity, the capital letter Y is followed by numbers (Y0 to Y10) to annotate common N-glycopeptide fragments from high-mannose glycans (Table 2); e.g., isotopic Y0 at charge 2 (annotated as "Y0 $\land$ 2+i") in Figure 4.

The presence of m/z = 197.0445 indicates the loss of  $C_2H_9NO_3$  loss from NeuAc;<sup>21</sup> the loss of  $C_2H_6O_3$ ,  $CH_6O_3$  and  $C_2H_4O_2$  serve to annotate HexNac.<sup>22</sup> After careful manual examination, the following annotations were added to the software:  $C_7H_5O_2$ ,  $C_8H_7O_3$ ,  $C_{11}H_5NO$ ,  $C_9H_7O_4$ ,  $C_9H_{10}NO_4$ , and  $C_9H_{11}O_6$ .

As a critical step in MS\_Piano, when a peak in a spectrum could be annotated with multiple product ions, they are prioritized in the following order: precursor (p), Y, glycopeptides, glycan oxonium ions, y or b, y' or b', immonium ions or fragments from modifications, a or a' ions. Prioritizing peak annotations facilitates optimal library searching results.



**Figure 3.** An example high resolution higher-energy collision-induced dissociation (HCD) mass spectrum with normalized collision energy (NCE) 20% of a peptide with iTRAQ and carbamidomethyl (CAM) modifications at charge 3 annotated with MS\_Piano. The highlighted annotations are neutral losses, iTRAQ and its reporter ions, immonium ion (labeled with "I" in the beginning of the annotation, e.g., ICCAM), and internal fragments (labeled with "Int" in the beginning of the annotation, e.g., Int/PG). A product ion with multiple charge states is labeled with " $^{n}$ " before charge value, e.g., y6 $^{2}$  is y6 at charge state 2. The "Unassigned" value is the fraction of unannotated peak intensities among the top 20 peaks.

#### Table 1. Glycans for Annotation

<sup>a</sup>Nonsugar modifications.

abbreviation	sugar	full name
G	HexNAc	N-Acetylhexosamine
Н	Hex	Hexose
F	Fuc	Fucose
S	NeuAc	Neuraminic acid
Sg	NeuGc	N-Glycolyl neuraminic acid
Р	Pent	Pentose
So <sup>a</sup>	SO <sub>3</sub>	
Po <sup>a</sup>	HPO <sub>3</sub>	

An example spectrum of an N-glycopeptide in Figure 4 shows that MS\_Piano annotates the fragments of glycans, peptides, and glycopeptides, enabling the rapid validation of a glycopeptide identification.

### Parameters for Evaluating Spectral Quality

In addition to possible product ion(s), each peak in a spectrum is annotated with the mass difference between the measured and theoretical m/z values. The default mass tolerance range is set as 20 ppm and can be customized by users by adding the option such as "-r 10ppm" or "-r 0.4 Da" for high and low resolution spectra, respectively. Furthermore, spectrum quality



**Figure 4.** An example of an N-glycopeptide spectrum, acquired on high-resolution HCD with normalized energy (NCE) 38%, annotated with MS\_Piano. Product ions a1, a2, a3, and b'4+G are confirmed with b1, b2, b3, and b'4 respectively. Peaks were labeled in different colors for product ions of glycans (red), peptides (green), and glycopeptides (blue).

### Table 2. N-Glycopeptide Fragments for Annotation

abbreviation	fragments
YO	no glycans
Y1	Y0+{G}
Y2	Y0+{G2}
Y3	Y0+{G2H}
Y4	Y0+{G2H2}
Y5	Y0+{G2H3}
Y6	Y0+{G2H4}
Y7	Y0+{G2H5}
Y8	Y0+{G2H6}
Y9	Y0+{G2H7}

is measured with the fraction of unannotated peak intensities among the top 20 peaks (Unassigned, in Figures 3 and 4) or all the peaks (Unassigned\_all), the intensity of the highest unassigned peak (max\_unassigned\_ab, % of base peak), and number of unassigned peaks in top 20 peaks (top\_20\_num\_unassigned\_peaks) or number of unassigned peaks (num\_unassigned\_peaks), etc. By using these parameters, users can easily assess spectrum quality to verify peptide identification.

# SOFTWARE DESCRIPTION

MS\_Piano was developed in Microsoft Visual C++ 2015 and is released in 2 formats: .exe and .dll (peptide annotation only). The .exe software can be directly used without installation on the Windows operating system. The command is simple; e.g., MS\_Piano C:\in.msp C:\out.msp.

### Data Input and Output

The NIST text file format (msp) is used for input and output of m/z vs intensity lists. The following screenshots (Figure 5) illustrate an example spectrum of a peptide in an msp file annotated with MS\_Piano software. In the input file, the following information is required for annotation: peptide

input:

sequence, modifications (optional), charge state, precursor m/z value (Parent, optional), number of peaks (Num peaks) and a peak list with m/z and intensity values. The peptide information is listed in the Name line. In the output file, MS\_Piano annotates peaks with product ions and mass difference between experimental and theoretical m/z value. The output file also provides the parameters described above to indicate spectral quality.

### Visualization

Tandem mass spectra with peaks annotated with reliable product ions in the output file can be viewed (Figures 4, 6) in the MS Search program<sup>12</sup> to facilitate validation and generate figures for publications and presentations. The annotated peaks with fragments of peptides, glycans, and glycopeptides in a mass spectrum can be displayed in different colors by adjusting color and fonts in the MS Search version 2.5 or later.

# SOFTWARE PERFORMANCE, TESTING, AND APPLICATION

MS Piano.exe program was tested for performance on a desktop computer, Windows 10 Enterprise with Intel(R) Core(TM) i7-6700 CPU @ 3.40 GHz with 64 GB memory. As an example of performance, MS Piano took <1.5 h to annotate 1 million high resolution mass spectra of peptides from protein digest samples by processing 4 files in parallel, each containing 250 000 identified spectra. Peptide length was 10-30, charge state from 2 to 5, with 0-4 modifications, and 30-500 peaks in 95% of these testing spectra. These spectra were first converted to msp files (mass vs intensity peak lists in text format) from the MS-GF+9 searching results. For glycopeptide spectra, the annotation time increases with the number of sugars in the glycans. MS\_Piano was tested and refined by annotating the msp files converted from MS-GF+<sup>9</sup> searching output files of all the data generated in Study 3 of the Clinical Proteomic Tumor Analysis Consortium (NCI/NIH);

```
Name: GAEGHPGERPPHSVPNNAR/4 2(0,G,TMT)(15,N,Deamidation)
Comment: Parent=553.0310
Num peaks: 138
130.1348 258.77
155.0821 64.03
430.2168 55.74
712.3787 48.43
764.8841 1000.6
765.3854 733.71
. . .
output:
Name: GAEGHPGERPPHSVPNNAR/4 2(0,G,TMT)(15,N,Deamidation)
Comment: Parent=553.0310 Theo mz=553.0320 Theo mz diff=-1.7ppm
Unassigned_all_20ppm=0.3109 Unassigned 20ppm=0.1597
num unassigned peaks 20ppm=70 max unassigned ab 20ppm=0.33
top 20 num unassigned peaks 20ppm=4/20
Num peaks: 138
130.1348 258.77 "TMT130N/-0.2ppm"
155.0821 64.03 "Int/PG/3.9ppm"
430.2168 55.74 "b15-NH3^4/-9.0ppm"
712.3787 48.43 "?"
764.8841 1000.6 "y14^2/-0.4ppm"
765.3854 733.71 "y14^2+i/-0.5ppm"
. . .
```

Figure 5. An example spectrum of a peptide in an msp file annotated with MS Piano.



**Figure 6.** An example of energy dependence fragmentation of an N-glycopeptide (in Alpha-1-acid glycoprotein in plasma) in charge 3 annotated with MS\_Piano. Peaks in 4 high-resolution HCD spectra at different collision energies were labeled in different colors for product ions of glycans (red), peptides (green), and glycopeptides (blue).

"Unassigned %" and other parameters described above together with MS-GF+ searching score were used to evaluate spectral quality and identification. This software has annotated 90 784 MS<sup>2</sup> spectra of all dipeptides, all tryptic tripeptides, and 1828 bioactive commercial peptides (purity >90%) in the NIST Tandem Mass Spectral Library.<sup>23,24</sup> It has been used in annotating mass spectra of digests from iTRAQ and TMT labeled proteins<sup>25</sup> and human hair.<sup>26</sup> It is also used routinely to annotate high resolution mass spectra and evaluate spectral quality for optimal search for refining the NIST Peptide Tandem Mass Spectral Library<sup>13</sup> with more than 4.3 million spectra. MS\_Piano has been used to annotate mass spectra of protein digests of single glycoproteins (Figure 6) including the Spike Protein in SARS-CoV-2.

### DISCUSSION AND CONCLUSIONS

MS Piano enables the annotation of tandem mass spectra of both peptides and N-glycopeptides that contain virtually all known modifications. A key feature of MS\_Piano is its capability to annotate one million peptide spectra in <2 h with reliable product ions, including some common but usually neglected fragments. The annotated spectra can be viewed with diverse ions displayed in different colors in NIST MS Search<sup>12</sup> browser for enhanced visual examination. Annotated spectra can be used to validate spectra and verify peptide identified by sequence database searching directly or embedded in other software packages to implement various proteomics data analysis software.<sup>27</sup> The output msp files of spectra annotated with MS Piano can be used on Skyline<sup>33</sup> platform directly. MS Piano provides a metric for spectrum quality and a reportable filter for constructing peptide mass spectral libraries. The software is helpful for understanding peptide fragmentation pathways. Its different formats provide flexibility for biologists and chemists to use .exe directly, or for advanced programmers to embed a functional .dll into other programs.

Due to the format complexity of raw data acquired on mass spectrometers from different manufactures and the peak lists lacking in searching results from various peptide and glycopeptide search engines, the simple text format (msp) is used for input, but users need to convert their files to this format to use this program. However, files can be combined from searching results from libraries, search engines, and de novo sequencing for annotation. We developed an msp file converter (free software convert2 msp, also available at the following MS Piano download website) which quickly converts the results from free protein and glycoprotein sequence searching engine MSFragger<sup>34</sup> and pGlyco,<sup>35</sup> respectively, to msp files, and automatically connects to MS Piano for spectral annotation to facilitate building-yourown libraries. More capabilities such as taking mzXML and pepXML together with raw data as input files, annotating mass spectra of negative mode, ETD and O-glycopeptides will be added to the software. Software, instructions, and examples can be freely downloaded at https://chemdata.nist.gov/dokuwiki/ doku.php?id=peptidew:ms piano.

### ASSOCIATED CONTENT

# **Supporting Information**

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jproteome.1c00324.

Product ions used in MS\_Piano; Table S1: Peptide modifications; Table S2: Immonium and fragment ions; Table S3: Neutral losses; Table S4: iTRAQ fragments; Table S5: TMT fragments; Figure S1: Two examples of low-resolution ion trap mass spectra of a peptide Bradykinin with sequence RPPGFSPFR at charge 2 and 3 respectively annotated with MS\_Piano (XLSX)

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### Notes

Certain commercial software or instruments are identified in this paper in order to specify the experimental procedure adequately. Such identification is not intended to imply recommendation or endorsement by the National Institute of Standards and Technology, nor is it intended to imply that the software or instruments identified are necessarily the best available for the purpose.

The authors declare no competing financial interest.

## ACKNOWLEDGMENTS

The authors thank Drs. Lewis Geer, Guanghui Wang, Oleg Toropov, Zheng Zhang, Sergey Sheetlin and William Wallace who have provided suggestions, useful discussions, feedback, and technical support that have helped the improvement of the software.

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