# glyXtool<sup>MS</sup>: An Open-Source Pipeline for Semi-Automated Analysis of Glycopeptide Mass Spectrometry Data

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Abbreviations: Immunoglobulin gamma (IgG), mass spectrometry (MS), precursor ion scan (MS1), fragment ion scan (MS2), normalized collision energy (NCE), collision-induced dissociation (CID), higher-energy collisional dissociation (HCD), The OpenMS Proteomics Pipeline Assistant (TOPPAS), reversed phase (RP), liquid chromatography (LC), electrospray ionization (ESI), orbitrap (OT), mass spectrometry (MS), tandem mass spectrometry (MS/MS), N-acetylhexosamine (N or HexNAc), N-acetylglucosamine (GlcNAc), hexose (H or Hex), N-acetylneuraminic acid (Sa or NeuAc), N-glycolylneuraminic acid (Sg or NeuGc), fucose (F or dHex), false-discovery rate (FDR)

ABSTRACT: For glycoproteomic analyses several web tools and standalone software packages have been developed over the recent years. These tools try to support or replace the time-consuming, cumbersome and error-prone manual spectra analysis and glycopeptide identification. However, existing software tools are usually tailored to one fragmentation technique and only present the final analysis results. This makes manual inspection and correction of intermediate results difficult or even impossible. We solved this problem by dividing the analysis tasks into modular tools with defined functions, which are executed within a software pipeline with a graphical editor. This gives users a maximum of flexibility and control over the progress of analyses. Here, we present the open-source python software suite glyXtool<sup>MS</sup>, developed for the semi-automated analysis of N- and O-glycopeptide fragmentation data. glyXtool<sup>MS</sup> is built around the pipeline engine of OpenMS (TOPPAS) and provides a glycopeptide analysis toolbox for the analysis, interpretation and visualization of glycopeptide spectra. The toolbox encompasses (a) filtering of fragment spectra using a scoring scheme for oxonium ions, (b) in-silico digest of protein sequences to collect glycopeptide candidates, (c) precursor matching to possible glycan compositions and peptide sequences, and finally (d) an annotation tool for glycopeptide fragment ions. The resulting analysis file can be visualized by the glyXtool<sup>MS</sup> Evaluator, enabling further manual analysis, including inspection, verification, and various other options. Using higher energy collisional dissociation data from human immunoglobulin gamma (IgG) and human fibrinogen tryptic digests, we show that glyXtool<sup>MS</sup> enables a fast, flexible and transparent analysis of N- and Oglycopeptide samples, providing the user a versatile tool even for explorative data analysis. glyXtool<sup>MS</sup> is freely available online on https://github.com/glyXera/glyXtoolMS licensed under the GPL-3.0 open-source license. The test data are available via ProteomeXchange with identifier PXD009716.

Protein glycosylation is one of the most common cotranslational modifications of proteins in eukaryotes.<sup>1</sup> Despite consisting of only a small number of monosaccharide building blocks, various topologies, branching and linkage variations can yield a very high number of glycan structures.<sup>2</sup> The presence of such structures on a protein can heavily influence glycan properties and thus their biological role involving intercellular adhesion, cell growth, immune response or the protein folding and protein stability.<sup>3</sup> In case of Nglycosylation, glycans are linked to the protein backbone via the amino group of asparagine and site occupation is limited to the consensus sequence of Asn-X-Ser/Thr, with X being any amino acid except proline.<sup>4</sup> O-glycosylation occurs on the hydroxyl group of either serine or threonine with no known consensus sequence. N-glycans share a common trimannosyl core structure,<sup>5</sup> while for O-glycans at least eight core structures have been identified so far.<sup>6</sup>

In contrast to glycomics and proteomics, the analysis of glycopeptides with mass spectrometry allows the simultaneous study of the glycan and peptide moiety, which enables the site-specific analysis of protein glycosylation.7 Glycopeptides are typically generated through proteolytic cleavage - most commonly by trypsin. In some cases a lack of tryptic cleavage sites in the vicinity of potential glycosylation sites, requires using proteases with a broader cleavage specificity.8-11 Due to the normally lower abundance of glycopeptides within the digested peptide mix, and the suppression of the glycopeptide signal in presence of non-glycosylated peptides, a glycopeptide enrichment step is often required prior to the chromatographic separation and measurement via mass spectrometry<sup>12</sup>. Various fragmentation techniques are used for the study of glycopeptides, such as collision-induced dissociation (CID), higher-energy collisional dissociation (HCD), and electron transfer dissociation (ETD), which generate different fragments of the glycan (B- and Yions) and/or the peptide moiety (a-, b-, c-, x-, y- and zions).13-15

For the analysis of glycopeptide mass spectrometry data, various software tools have been published over the recent years, referenced within several reviews.<sup>16-18</sup> The majority of tools are available as web tools (GlycoMaster,<sup>19</sup> GlycoMod,<sup>20</sup> GlycoPeakFinder,<sup>21</sup> GlycoPepDetector,<sup>22</sup> GlycoPepGrader,<sup>23</sup> GlycoPep ID,<sup>24</sup> GlycopepDB,<sup>25</sup> GlycopeptideID,<sup>26</sup> Protein Prospector<sup>27</sup>). Some tools can be downloaded as standalone software (GlycoFragWork,28 GlycoPep Evaluator,<sup>29</sup> GlycopeptideSearch,<sup>30</sup> GlycoWorkbench,<sup>31</sup> GlypID 2.0,<sup>32</sup> IGAP,<sup>33</sup> MAGIC,<sup>34</sup> pGlyco<sup>35</sup>). However, about half of the tools are only available on request, or have been discontinued due to funding issues (Sweet Substitute,<sup>36</sup> Sweet-Heart,<sup>37</sup> Branch-and-Bound,<sup>38</sup> GlycoMiner,<sup>39</sup> GlycosidIQ,<sup>40</sup> GlycoSpectrumScan,<sup>41</sup> GlyDB,<sup>42</sup> GPQuest,<sup>43</sup> I-GPA,<sup>44</sup> Peptoonist<sup>45</sup>). As open-source only five tools are available: SweetSEQer,<sup>46</sup> GPFinder<sup>47</sup> (based on GlycoX<sup>48</sup>), GlycoSeq,<sup>49</sup> XGlyScan<sup>50</sup> and GlycoPAT<sup>51</sup>. As commercial tools Byonic (Protein Metrics Inc., San Carlos, CA, USA),<sup>52</sup> ProteinScape (BRUKER Bremen), 53,54 DALTONIK GmbH, and

BiopharmaFinder (Thermo Scientific, Waltham, MA, USA) are available.

Hu et.al.55 extensively reviewed the state of current glycopeptide analysis software and identified significant areas in data analysis requiring further development. This included peptide and glycan structure confirmation using database-based methods, de novo sequencing, spectral libraries, validation methods, and glycan quantification. Since many tools complement each other, a focus on tool extension and integration into larger tool pipelines is emphasized. To provide higher flexibility for each stage of the identification, the authors recommend the modularization of those tools.

OpenMS<sup>56</sup> is an open-source software that employs tool modularization as a strategy for proteomics experiments. It provides a variety of small tools with a defined proteomics function, which can be linked to form complex analysis pipelines. These pipelines can be executed with the provided OpenMS Proteomics Pipeline Assistant (TOPPAS) engine.<sup>57</sup> To gain insights into each intermediate analysis step and to ensure suitable tool parameters, all MS data can be visualized using the TOPPView software,<sup>58</sup> together with analysis results provided by each tool. The use of a pipeline engine allows the storage of steps performed, thus enabling data re-analysis if necessary. Another focus of OpenMS is the use of open formats for data exchange.

Here we present the open-source software suite  $glyXtool^{MS}$ , which provides a glycopeptide analysis toolbox that can be integrated into an OpenMS pipeline and run within the TOPPAS engine using the "Generic Wrapper" functionality. All tools are written in python, since OpenMS gives access to its native functions through the pyOpenMS library<sup>59</sup> making the code more accessible to other developers. Additionally, the software provides the *glyXtool<sup>MS</sup> Evaluator* – a tool for the visual inspection, verification and validation of results obtained by the analysis pipeline. In addition, it offers the possibility to check the results of each intermediate step.

To demonstrate the functionality and usability of glyXtool<sup>MS</sup>, the analysis of *N*-glycopeptides derived from human immunoglobulin gamma (IgG) as well as *O*-glycopeptides from human fibrinogen is shown exemplarily. The data have been deposited to the ProteomeXchange Consortium via the PRIDE<sup>60</sup> partner repository with the dataset identifier PXD009716. glyXtool<sup>MS</sup> is available online on

https://github.com/glyXera/glyXtoolMS licensed under the GPL-3.0 open-source license.

# MATERIAL AND METHODS

#### **General Software Setup**

For the automated glycopeptide analysis an OpenMS pipeline was created and extended with new glycopeptide analysis tools. To enable the visual inspection of analysis results from the OpenMS pipeline and for further manual data/spectra inspection, verification and validation, the *glyXtool<sup>MS</sup> Evaluator* was developed. The general software setup is depicted in Figure 1. The OpenMS pipeline (A) combines native OpenMS tools which provide basic mass spectrometry data analysis functions, with glyXtool<sup>MS</sup> tools (python scripts) which supply additional glycopeptide analysis functionality. The pipeline and each tool parameter can be adapted by the user according to the analysis problem. After the pipeline has generated an analysis file, the  $glyXtool^{MS}$  Evaluator (B) can be used to inspect, verify, and validate identification results as well as to review the parameters used for the analysis. The glyXtool<sup>MS</sup> Evaluator provides in-depth analysis functionalities as it enables the manual annotation of fragment ion spectra along with the addition of new identifications (manual de novo sequencing). It also allows to remove false-positive identifications. Parts of the pipeline can be run separately by adapting the necessary input nodes (e.g. substituting the preprocessing part with an input node). The glyXtool<sup>MS</sup> python library (C) provides glycopeptide functionality to the pipeline tools (A), the glyXtool<sup>MS</sup> Evaluator (B), and for future glycopeptide analysis tools provided for the OpenMS TOPPAS engine.

#### **Experimental Data**

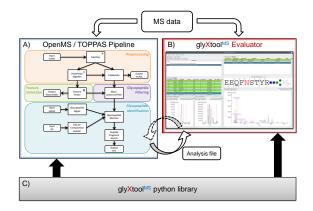
As example data sets tryptic digests of human IgG for the analysis of *N*-glycosylation and human fibrinogen for *O*-glycosylation have been measured by nano reversed phase liquid chromatography coupled online to an electrospray ionization orbitrap mass spectrometer (nano RP-LC ESI- OT-MS/MS; LTQ Orbitrap Elite, Thermo Scientific, Waltham, MA, USA) with HCD fragmentation. For more details on the measurement, please refer to the Supplementary Material Section 1.

### **Data Preparation**

The measured raw data-files have been converted into mzML format using *msconvert* included in ProteoWizard (Version 3.0.7408).<sup>61</sup>

Additionally, a general database of *N*-glycan compositions was generated by parsing structures in GlycoCT format from glycomeDB (downloaded from http://www.glycome-db.org/getDownloadPage

<u>.action?page=structure glycoct</u>, date: 2015-12-16). To distinguish *N*-glycans from *O*-glycans, the presence of the trimannosyl core structure for *N*-glycans was required. Afterwards the remaining compositions have been manually assessed for plausibility. To ensure the inclusion of human IgG and human fibrinogen glycan compositions within the database, a list of compositions was compiled from Selman et al.<sup>62</sup> and Mimura et al.<sup>63</sup> for human IgG. In case of human fibrinogen, *N*- and *O*-glycan compositions reported by Zauner et al.<sup>64</sup> have been used as cross-reference. The test data are available via ProteomeXchange with identifier PXD009716



**Figure 1.** Software. The software suite glyXtoolMS consists of three parts: A) a set of glycopeptide tools that can be used within an OpenMS pipeline for the automated generation of an analysis file from the mass spectrometry data, B) a visual interface for further manual analysis of the analysis file, and C) the glyXtoolMS python library, which contains reusable functions for the glycopeptide analysis.

#### Software Libraries

For the development of glyXtool<sup>MS</sup>, python<sup>TM</sup> 2.7.3 was used (<u>www.python.org</u>). The OpenMS software (Version 1.11) was cloned from the development branch and compiled according to the installation notes. Additionally, the generation of the pyOpenMS package was included during compilation, in order to use the OpenMS functionality within python scripts.

Multiple packages were used to extend the python functionality, most of which were installed via PIP version 1.5.4 (pypi.python.org/pypi/pip). For mathematical operations and matrix calculations numPy 1.6.1 (www.numpy.org) was the general choice. For presentation of results in an excel spreadsheet, package xlwt version 1.0.0 (pypi.python.org/pypi/xlwt) was included. For parsing and writing files in xml format, the software lxml 2.3.2 (www.lxml.de) provided the necessary python bindings to interface with the C library libxml2. For reading config-files, the utility configparser 3.3.0r2

(pypi.python.org/pypi/configparser) has been included. In order to parse command line options, the package argparse 1.2.1 (pypi.python.org/pypi/argparse) was used.

# glyXtool<sup>MS</sup> Python Package

All written software code has been compiled into one python package. The package is available under https://github.com/glyXera/glyXtoolMS under the GPL-3.0 open-source license.

#### Software Requirements and Limitations

The software has been tested on Linux and Windows machines. The setup currently needs a working version of OpenMS together with pyOpenMS as well as a python 2.7.x installation.

#### **Software Comparison**

The performance of glyXtool<sup>MS</sup> was compared to the open-source software MAGIC-web

(<u>http://magic.iis.sinica.edu.tw/index.html</u>)<sup>34</sup> and the commercially available Byonic software<sup>52</sup> (Protein Metrics Inc., San Carlos, CA, USA) version v2.11.0

together with Byologic version v2.7-29. To this end a human IgG dataset was analyzed with each software.

For the analysis with MAGIC, the targeted approach (MAGC+) as well as the untargeted approach (MAGIC + Mascot + Results Integrator) were used. The results of both approaches were combined. The necessary mgf file was generated from the mzML file using the *FileConverter* tool within OpenMS. Due to parsing errors during the file upload into MAGIC+, the scan titles within the mgf file required renaming to 'scan' + scan number, which corrected the parsing error. For the analysis, the suggested standard parameters were used, except for the case that the monosaccharides "Pentose" and "Neu5Gc" were unselected.

In case of the Byonic/Byologic analysis, the parameters were set to a tryptic digest with full digestion specificity, a mass tolerance of 10 ppm and CID low energy were chosen as a fragmentation type. As amino acid modifications carbamidomethyl on cysteine and oxidation on methionine as "common1" modifications were included. For the glycan composition database, the provided "*N*-Glycan 50 common biantennary" file was used.

## **RESULTS AND DISCUSSION**

A software package has been developed for the flexible and transparent analysis of glycopeptide mass spectrometry data. It consists of two major parts: a collection of glycopeptide specific tools for the automated processing within an OpenMS TOPPAS engine, and a graphical user interface called *glyXtool<sup>MS</sup> Evaluator* for the assisted inspection, verification and validation of the results. The use of the OpenMS TOPPAS engine enables the user to create flexible analysis pipelines, since it supports rearrangement, addition or removal of tools as well as control over the analysis parameters. Here the purpose of each processing step and its tools shown in Figure 2 will be illustrated using human IgG and human fibrinogen as example data sets.

#### Preprocessing

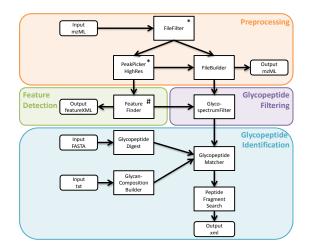
The preprocessing steps are used to generate uniform input mass spectrometry data for the glycopeptide analysis tools. Required are profile precursor ( $MS^1$ ) scans together with centroided fragment ( $MS^2$ ) scans, sorted by increasing retention time. Sorting the spectra is handled by the *FileFilter* tool of OpenMS, while the *PeakPicker* and the *FileBuilder* tools handle the spectra type conversion. Depending on the type of mass spectrometer or the vendor format, the requirements can already be fulfilled and the preprocessing steps can be removed from the pipeline.

#### **Feature Detection**

As a data reduction measure, a FeatureFinder tool is used that establishes a link between fragment spectra and individual analytes by using the feature border and precursor positions (see Supplementary Figure S-2). Additionally, the charge state and the monoisotopic masses are corrected, which can be useful in case the mass spectrometer reports only an average monoisotopic precursor mass.

OpenMS provides a wide range of FeatureFinders, for example the *FeatureFinder Centroided* tool which

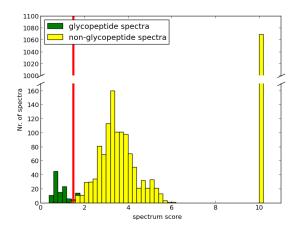
has been tested within our analysis pipeline. However, the focus of the FeatureFinder Centroided is on quantification. Thus, it removes features with low intensity or poor chromatographic peak shape, ultimately leading to fragment spectra without a feature. To ensure a high coverage of fragment spectra with features, a new FeatureFinder called FeatureFinderMS has been developed that uses each precursor position as a starting seed. Theoretical isotopic patterns are used to create a feature even for low-quality precursors. A detailed description of the FeatureFinderMS tool can be found in the Supplementary Material Section 2.1 and Supplementary Figure S-3.



**Figure 2.** This schematic shows the general TOPPAS pipeline including input nodes, processing tools, output nodes and all connections utilized for the automated glycopeptide analysis. Native OpenMS tools are depicted with a '\*'; for the FeatureFinder an alternative FeatureFinder tool was developed which can be used instead, marked by a '#'. The remaining tools are python scripts run with the Generic Wrapper functionality in OpenMS. Inputs are the raw data in mzML format, possible protein sequences in FASTA file format, and a text file with provisional glycan compositions. The output node stores the full glycopeptide analysis results in xml file format. The full TOPPAS pipeline can be found in the Supplementary Figure S-1.

#### **Glycopeptide Filtering**

The *GlycospectrumFilter* tool classifies the provided fragment spectra into glycopeptide spectra and nonglycopeptide spectra. The underlying scoring principle is based on the scoring algorithm for O-GlcNAc peptides from Hahne et al.65, and was extended to process N- and O-glycan compositions. Fragment ions of each spectrum are matched against oxonium ions defined in Table 1 and oxonium losses from the precursor, shown in Supplementary Figure S-4. To minimize false-positive matches, an ion is only matched if its identity is in agreement with other already identified ions (these dependency rules are defined in Table 1). Consideration of certain oxonium ions can be excluded manually within the tool parameters, e.g. presence of a specific type of sialic acid (NeuAc or NeuGc) or fucosylation. Based on the peak intensity (normalized to the total spectrum intensity) and peak ranking of all matched ions, a spectrum score is calculated. Due to the log-negative scoring, a lower score signifies a higher probability of the spectrum to be a glycopeptide spectrum.



**Figure 3.** Glycopeptide score distribution of the  $MS^2$  spectra. The stacked bar chart shows the score distribution of the individual fragment spectra from the human IgG sample and the threshold used for classification. Scoring has been performed with a  $\pm 0.05$  Da mass accuracy setting. Each spectrum in the sample has been manually assessed as glycopeptide/non-glycopeptide. Visible are two distinct populations between the glycopeptides (green, 174 spectra) and the non-glycopeptides (yellow, 839 spectra). For non-glycopeptide spectra that do not contain masses which match oxonium ions or oxonium losses, no score could be calculated, thus a default score of 10 has been assigned. With a threshold of 1.5 the glycopeptide spectra (red line).

Figure 3 shows the resulting histogram for the spectrum score distribution of all fragment spectra acquired for the IgG sample. To determine false positives and false negatives, each spectrum has been manually assessed for its glycopeptide identity, which allows the color coding of the distributions: the glycopeptide spectra distribution is shown in green; the broader distribution of non-glycopeptide spectra is shown in yellow. For non-glycopeptide spectra without any ion matches, no score can be calculated. Therefore, a default score of 10.0 was assigned to these spectra. The populations can be distinguished via a threshold of 1.5. leading to 11 false-positive, 1 false-negative, 2168 true-negative, and 102 true-positive glycopeptide identifications within the IgG dataset. Example spectra of each group can be found in the Supplementary Figure S-5. From the receiver operating characteristic curve (ROC plot) shown in Supplementary Figure S-6, the highest accuracy of 0.996 was achieved with a threshold of 1.41.

Scored fragment spectra sharing the same precursor are then grouped into one feature (visualized in Supplementary Figure S-2). By using the grouping information, a consensus spectrum of the fragment spectra is created for each glycopeptide feature by merging up to 300 peaks from each fragment spectrum. Afterwards, the resulting consensus spectrum is used in the subsequent glycopeptide identification steps. The tool reports results in xml format, containing information about the fragment spectra and the features.

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Table T	<b>Oxonium ions</b>	used for gr	y copeptide i	cor mg

Туре	Oxonium ion	Mass	Depends
		[M+H+]	on
General	$N_1$	204.0867	$H_1 - H_2O$
	$N_1 - H_2O$	186.0761	$N_1$
	$H_1$	163.0601	$H_1 - H_2O$
	$H_1 - H_2O$	145.0495	$H_1$
	$N_1H_1$	366.1395	-
	$N_1H_2$	528.1923	-
Contains	Sa <sub>1</sub>	292.1027	Sa <sub>1</sub> - H <sub>2</sub> O
NeuAc	Sa <sub>1</sub> - H <sub>2</sub> O	274.0921	Sa <sub>1</sub>
	$N_1H_1Sa_1$	657.2349	$Sa_1$
	N <sub>1</sub> H <sub>2</sub> Sa1	819.2877	$Sa_1$
Contains	$Sg_1$	308.0976	$Sg_1 - H_2O$
NeuGc	$Sg_1 - H_2O$	290.0870	$Sg_1$
	$N_1Sg_1$	511.1770	$Sg_1$
	$N_1H_1Sg_1$	673.2298	$Sg_1$
	$N_1H_1Sg_2$	980.3201	$Sg_1$
Contains	$N_1H_1Sa_1Sg_1$	964.3252	NeuAc1
NeuAc	-		$Sg_1$
and NeuGc			
Contains	$F_1$	147.0652	$F_1 - H_2O$
fucose	$F_1 - H_2O$	129.0546	$F_1$
	$N_1H_1F_1$	512.1974	$F_1$
Contains	$N_1H_1Sa_1F_1$	803.2928	$Sa_1F_1$
NeuAc and			
fucose			

Here, the masses of all oxonium ions used for the scoring of the glycopeptide spectra are listed. The oxonium ions are classified into types to allow the selective scoring according to the analysis. From manually annotated glycopeptide spectra a list of dependencies has been created, which reduces false-positive assignments. The oxonium ions are only used to calculate the final score if the dependent oxonium ion(s) as listed above were also detected within the spectrum. For example, HexNAc1 and HexNAc1 - H2O are only scored if both ions are present within the spectrum.

#### **Glycopeptide Identification**

After the search for glycopeptide features, a precursor mass matching to all possible combinations of peptide and glycan masses is performed by the *GlycopeptideMatcher* tool. For the glycan composition input either a file containing possible glycan compositions can be supplied, or the GlycanCompositionBuilder tool generates a set of possible compositions in silico. The theoretical peptide masses are generated by the GlycopeptideDigest tool, which uses protein sequences provided by the user to identify peptides containing an N- and/or Oglycosylation of site. The output the GlycopeptideDigest tool is a file in xml format, containing all possible peptide sequences, relying on to the number of missed cleavages, fixed and variable modifications. Also reported are the positions of the glycosylation sites and the peptide mass.

#### **Peptide Fragment Search**

In case of the example IgG dataset, HCD has been used as a fragmentation technique that generates a number of peptide fragments, which are predominantly single charged but also double charged y- and b-ions, together with the peptide ( $Y_0$ ), the peptide with ammonia loss ( $Y_0$ -NH<sub>3</sub>), and the peptide plus HexNAc ( $Y_1$ ) ions). The existence of these ions can be used to reduce false-positive identifications from the Glycopeptide Matcher tool. The Peptide Fragment Search tool generates the theoretical a, b-, c- and x-, y-, z-ion series based on the peptide sequence and its modifications, and matches it against the fragment ions of the consensus spectrum with a mass tolerance defined by the user.

# glyXtool<sup>MS</sup> Evaluator

The results from each analysis tool are collected within an analysis file in xml format, which is the input for the *glyXtool<sup>MS</sup> Evaluator* for further manual evaluation. The *glyXtool<sup>MS</sup> Evaluator* visualizes the results of each tool, provides the opportunity to screen and edit possible false-positive results (partially also false-negative results), and enables further manual analysis. A screenshot of the software tool with the loaded IgG analysis is shown in Figure 4.

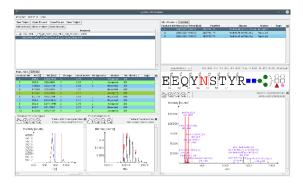


Figure 4. This screenshot shows the results after loading the mass spectrometry raw data file and an analysis file from the OpenMS pipeline into the glyXtool<sup>MS</sup> Evaluator. On the lower left side all features classified as glycopeptide features are shown. For the selected feature the extracted ion chromatogram of the precursor and its isotopic pattern are visualized, together with its consensus fragment spectrum on the lower right side. Within the spectrum, the oxonium ions found by the GlycospectrumFilter tool are marked in red. The identifications tab shows all identifications for the selected feature, suggested by the Glycopeptide Matcher tool. By selecting an identification, the fragment spectrum is updated with the y- and b- ion series of the peptide sequence and other glycopeptide fragments calculated by the Peptide Fragment Search tool.

The "Projects" tab shows the loaded project consisting of one mass spectrometry file (in mzML format, created by the FileBuilder tool). This file is used by the glyXtool<sup>MS</sup> Evaluator to access the raw data in order to show isotopic patterns and elution peaks. To the mass spectrometry file, the corresponding analysis file containing the spectra scoring results and glycopeptide identifications is loaded. Loading multiple additional analysis files is also supported, which is helpful to investigate the influence of different parameter settings during the analysis. The "Analysis" tab in Figure 4 visualizes the different tool results (shown here is the "identification" tab where the GlycopeptideMatcher and the PeptideFragmentSearch results are visualized). In addition, the fragment spectrum and the peptide sequence coverage are shown for the selected identification. A manual status ("Accepted", "Rejected" and "Unknown") can be set after manual review of the identification. On the upper

right of Figure 4, the mass deviation of each identification is plotted, which supports verification of the selected accuracy in the *GlycopeptideMatcher* tool.

Multiple functions are provided for further in-depth manual analysis. A filter function allows the selection of the results through various properties, like precursor mass, existence of fragment ions, glycosylation site, and more. Additionally, regular expressions can be used on glycan and peptide names. The fragmentation spectra can be annotated manually with a mass distance ruler. Identifications can be added or modified by assigning a glycan composition and peptide sequence to an existing feature. The analysis file can also be reanalyzed by the automated pipeline engine, if for example features or other parameters have been manually changed.

Table 2. Results of N-glycopeptide analysis forhuman IgG

Peptide/ Glycan	<b>IgG 1</b> EEQY <u>N</u> STYR	IgG 2 EEQF <u>N</u> STFR	<b>IgG 3/ IgG 4</b> EEQY <u>N</u> STFR/ EEQF <u>N</u> STYR
N <sub>4</sub> H <sub>3</sub>	830.0 <sup>3+</sup> [14.8] 1244.5 <sup>2+</sup> [14.9]		
$N_4H_4$	1325.5 <sup>2+</sup> [14.7]		
$N_4H_5$	938.0 <sup>3+</sup> [14.5]		
$N_5H_4$		941.0 <sup>3+</sup> [17.1]	
$N_3H_3F_1{}^*$	1216.0 <sup>2+</sup> [14.7]	$1200.0^{2+}$ [17.0]	
$N_3H_4F_1{}^*$	1297.0 <sup>2+</sup> [14.5]	1281.0 <sup>2+</sup> [16.9]	
$N_4H_3F_1$	878.7 <sup>3+</sup> [14.7] 1317.5 <sup>2+</sup> [15.1]	868.0 <sup>3+</sup> [17.0] 1301.5 <sup>2+</sup> [16.7]	
$N_4H_4F_1$	932.7 <sup>3+</sup> [15.4] 1398.6 <sup>2+</sup> [14.9]	922.0 <sup>3+</sup> [16.6] 1382.6 <sup>2+</sup> [17.5]	1390.6 <sup>2+</sup> [15.8]
$N_4H_5F_1$	1479.6 <sup>2+</sup> [14.8]	976.1 <sup>3+</sup> [16.9] 1463.6 <sup>2+</sup> [16.9]	
$N_4 H_6 F_1{}^\ast$	$1040.7^{3+} [14.2]$		
$N_5H_3F_1$	946.4 [14.9]	935.7 <sup>3+</sup> [17.2] 1403.1 <sup>2+</sup> [17.2]	
$N_5H_4F_1$	$1000.4^{3+}$ [13.2] $1000.4^{3+}$ [15.0]	$1484.1^{2+}$ [17.0]	
$N_5H_5F_1$	$1054.4^{3+}$ [14.9]	1043.8 [16.9]	
N4H4F1Sa1		$1019.1^{3+}$ [19.4] $1528.1^{2+}$ [19.4]	
$N_4H_5F_1Sa_1$	1083.8 <sup>5+</sup> [15.8]	1073.1 <sup>3+</sup> [19.9]	
$N_5H_5F_1Sa_1$			

The table shows the peptide/glycan matches found by the glycopeptide matcher tool. Each cell shows the detected ion masses, the charge states, and - in brackets - the retention time in minutes. Glycan names are abbreviated as "N": Hex<u>N</u>Ac, "H": <u>H</u>exose, "Sa": *N*-acetylneuraminic acid, "F": <u>F</u>ucose. All glycan compositions except the three marked with an asterix "\*" were reported by Selman et al.<sup>62</sup> and Mimura et al.<sup>63</sup>

#### **Analysis Results**

The *reporter* tool from the analysis pipeline can convert the content of the xml formatted result file into an excel spreadsheet. This shows the scores of each  $MS^2$  spectrum of the *GlycospectrumFilter* tool, along with the identified glycopeptide features, and the corresponding identifications. As an example, results for IgG is shown in Table 2. In addition, the identified *O*-glycopeptides from human fibrinogen are shown in Table3A+B. For each peptide and glycan composition the detected precursor mass and charge state is depicted.

Thirteen of twenty-four N-glycan compositions reported for human IgG by Selman et al.54 and Mimura et al.<sup>55</sup> were identified by glyXtool<sup>MS</sup>, each supported by the existence of oxonium ions and peptide fragments. Fourteen N-glycopeptides were found for IgG1 and twelve glycopeptides for IgG2. The peptide fragments were not sufficient to distinguish the peptide sequence isomers of IgG3 and IgG4, thus the two glycopeptides were assigned to both IgG species. Due to an isomeric mass equivalence between IgG1 containing fucosylated glycans and Ig3/IgG4 containing glycans with a hexose instead of a fucose, 33 false-positive assignments had to be manually removed in the glyXtool<sup>MS</sup> Evaluator by filtering the fragment spectra for the existence of the peptide and peptide-NH<sub>3</sub> ions. Overall, eight false-positive identifications remained with 40 true-positive

identifications. Some of the glycan compositions reported for human IgG could not be detected within the sample (N<sub>3</sub>H<sub>3</sub>, N<sub>5</sub>H<sub>3</sub>, N<sub>5</sub>H<sub>5</sub>, the single sialylated species  $N_4H_4Sa_1$ ,  $N_4H_5Sa_1$ ,  $N_5H_4Sa_1$ ,  $N_5H_4F_1Sa_1$ , N<sub>5</sub>H<sub>5</sub>Sa<sub>1</sub> and the double sialylated species N<sub>4</sub>H<sub>5</sub>Sa<sub>2</sub>,  $N_5H_5Sa_2$ ,  $N_4H_5F_1Sa_2$ ). These glycan compositions were either too low abundant within the sample or were not fragmented during the analysis. However, three new Nglycan compositions (N<sub>3</sub>H<sub>3</sub>F<sub>1</sub>, N<sub>3</sub>H<sub>4</sub>F<sub>1</sub>, and N<sub>4</sub>H<sub>6</sub>F<sub>1</sub>) were detected on IgG1 and IgG2 (marked with an asterisk Table 2) that were previously not reported. The compositions N<sub>3</sub>H<sub>3</sub>F<sub>1</sub> and N<sub>3</sub>H<sub>4</sub>F<sub>1</sub>could be clearly assigned using glyXtool<sup>MS</sup> via the corresponding peptide fragments. However, the fragment ion spectra identified for the composition N<sub>4</sub>H<sub>6</sub>F<sub>1</sub> in IgG1 and IgG2 show a mass deviation in the higher m/z range (> 30) ppm). Accordingly, glycopeptide fragment ions could not be assigned automatically, but could be identified manually. The same behavior was also observed for the IgG1 glycopeptide fragment ion spectrum identified with the N-glycan composition  $N_4H_3$  (precursor m/z 830.0<sup>3+</sup>).

1 Table 3. Results of N- and O-glycopeptide analysis for human fibrinogen

A) sp P02671 FIBA_HUMAN	$N_1H_1$	N1H1Sa1	$N_1H_1Sa_2$
253GG <u>S</u> T <u>S</u> YGTG <u>S</u> E <u>T</u> E <u>S</u> PR268	969.4 <sup>2+</sup> [14.4]	1115.0 <sup>2+</sup> [15.7]	
494HPDEAAFFD <u>T</u> A <u>ST</u> GK508		1125.5 <sup>2+</sup> [21.4] 750.7 <sup>3+</sup> [21.4]	847.7 <sup>3+</sup> [24.2]
540E <u>SSS</u> HHPGIAEFP <u>S</u> R554			862.4 <sup>3+</sup> [19.5]
562QFT <u>SSTS</u> YNR <b>573</b>		923.92+ [16.6]	
584MADEAGSEADHEGTHSTK601		843.7 <sup>3+</sup> [13.3]	

3 4 5

6

B) sp P02675 FIBB_HUMAN	N1H1Sa1	N4H4Sa1	N <sub>4</sub> H <sub>5</sub>	N4H5Sa1	N4H5Sa2
24EEAP <u>S</u> LRPAPPPI <u>S</u> GGGYR42	869.7 <sup>3+</sup> [22.3]				
347GTAGNALMDGASQLM(MSO)C	E <u>N</u> R365		$1177.8^{3+}$ [21.3]	956.4 <sup>4+</sup> [24.7]	
347GTAGNALM(MSO)DGASQLM(I	MSO)GE <u>N</u> R <sub>365</sub>			960.4 <sup>4+</sup> [21.1] 1280.2 <sup>3+</sup> [22.0]	1377.2 <sup>3+</sup> [26.6]
347GTAGNALM(MSO)DGASQLMC	E <u>N</u> R365	1220.8 <sup>3+</sup> [24.8]	1177.8 <sup>3+</sup> [22.1]	1274.8 <sup>3+</sup> [25.8]	1371.9 <sup>3+</sup> [30.5] 1029.2 <sup>4+</sup> [29.5]
347GTAGNALMDGASQLMGE <u>N</u> R36	5		1172.5 <sup>3+</sup> [24.9]	1269.5 <sup>3+</sup> [25.5] 1269.5 <sup>3+</sup> [27.8] 952.4 <sup>4+</sup> [27.7]	$1025.2^{4+} [31.4] 1025.2^{4+} [29.0] 1366.5^{3+} [31.9]$

Several glycopeptides could be found within the human fibrinogen dataset for the alpha and the beta chain. Table A shows the detected glycopeptide ions for the alpha chain, which contains only *O*-glycosylation. Table B shows the glycosylation of the beta chain, containing one *O*-glycopeptide and multiple *N*-glycans for the peptide <sup>347</sup>GTAGNALMDGASQLMGE<u>N</u>R<sub>365</sub>, which exhibits different degrees of oxidation of methionine.

The human fibrinogen sample shown in Table3A+B 8 contains both N- and O-glycopeptides. The provisional ğ peptides used in the analysis were generated from all 10 three human fibrinogen chain sequences. Two searches 11 with different glycan composition databases were 12 performed: a) only with mucin-type O-glycans, and b) 13 with the full N-glycan database derived from 14 glycomeDB plus the mucin-type O-glycans. The 15 automated analysis with the pipeline using only the O-16 glycan database resulted in nine correctly identified 17 glycopeptides together with 15 wrong assignments. 18 Fourteen of the wrong assignments could be removed 19 during manual analysis with the glyXtool<sup>MS</sup> Evaluator 20 using the existence of the peptide ion as a filter. For the 21 analysis with the N- and O-glycan database, the

pipeline generated a large number of false-positives (29
true-positives and 76 false-positives). By using the
filter function within the *glyXtool<sup>MS</sup> Evaluator* for the
selection of identifications containing the peptide and
peptide-NH<sub>3</sub> ions, the large number of false-positives
could be reduced to seven false-positives, while also
losing one true-positive assignment.

29 The O-glycosylation of the fibrinogen alpha chain in 30 Table3A contained three different O-glycan 31 compositions: N1H1, N1H1Sa1 and N1H1Sa2. Four 32 identified peptides were within the glycosylated regions 33 reported by Zauner et al.,<sup>56</sup> while the glycopeptide 34 584MADEAGSEADHEGTHSTK601-N1H1Sa1 has not 35 been reported, yet. The glycosylation of the beta chain 36 is shown in Table3B. It comprises one O-glycopeptide 37 and four different N-glycans on the N-glycosylation site 38  $N_{364}$ . The three *N*-glycan compositions  $N_4H_5$ ,  $N_4H_5Sa_1$ 39 and N<sub>4</sub>H<sub>5</sub>Sa<sub>2</sub> were also reported in Zauner et al.; 40 additionally, we could detect N<sub>4</sub>H<sub>4</sub>Sa<sub>1</sub> in the sample, 41 which can be explained as a sub-composition of 42 N<sub>4</sub>H<sub>5</sub>Sa<sub>1</sub>, missing one hexose. The reported N-43 glycosylation N<sub>52</sub> on the gamma chain could not be 44 detected in our sample.

# 45 Software Comparison

46 We compared the performance of glyXtool<sup>MS</sup> with 47 the commercially available software Byonic/Biologic 48 as well as the recently published MAGIC software<sup>31</sup> on 49 the results of the human IgG sample. The results are 50 shown within Table 4.

51 28 of a total of 30 glycopeptides were detected by glyXtool<sup>MS</sup>, 24 with Byonic, and 19 using MAGIC. Of 52 53 overall sixteen glycopeptides for IgG1, fourteen were 54 detected by glyXtool<sup>MS</sup>, thirteen by Byonic, and ten by 55 MAGIC. All twelve glycopeptides of IgG2 were 56 detected by glyXtool<sup>MS</sup>, nine by Byonic and eight by 57 MAGIC. The two glycopeptides of IgG3/IgG4 were 58 detected by glyXtool<sup>MS</sup> and Byonic, while the 59 composition N<sub>4</sub>H<sub>4</sub>F<sub>1</sub> was missed by MAGIC.

60 The limitation of MAGIC is mainly due to its 61 approach regarding the detection of peptide sequences. 62 In particular, the assumption that the triplet fragment 63 ion pattern (Y<sub>0</sub>, Y<sub>0</sub>-NH<sub>3</sub>, Y<sub>1</sub>) of the peptide and the 64 trimannosyl core must exist within the fragment 65 spectra. Additionally, Mascot searches did not result in 66 correct peptide assignments in several cases due to 67 unknown reasons.

68 All three tools reported additional unique 69 glycopeptides, which were not detected previously by 70 the other tools. The glycan composition  $N_4H_6F_1$  on 71 IgG1, and the glycan compositions  $N_5H_4$  and 72 N<sub>4</sub>H<sub>4</sub>F<sub>1</sub>Sa<sub>1</sub> on IgG2 were only reported by glyXtool<sup>MS</sup>. 73 The reason why both Byonic and MAGIC did not 74 identify these glycopeptides is unclear. Byonic reported 75 the composition N<sub>4</sub>H<sub>6</sub> on IgG1 - this identification 76 could be rejected within glyXtool<sup>MS</sup>, due to a wrong 77 assignment of the triplet peptide pattern. Later manual 78 79 analysis showed that the glycopeptide most likely was a sodium adduct of  $N_4H_5F_1$  on IgG1. MAGIC also 80 identified the composition N<sub>3</sub>H<sub>2</sub>F<sub>1</sub> on IgG1. This 81 composition could be explained as an in-source decay of other glycopeptides. Thus, only glyXtool<sup>MS</sup> was able 82 83 to correctly identify all 28 true glycopeptide candidates. 84 Furthermore, the possibility of glyXtool<sup>MS</sup> to show 85 intermediate and not only the final results was helpful 86 to evaluate the source of differences.

87

## 88 Table 4. Performance comparison between 89 glyXtool<sup>MS</sup>, Byonic and MAGIC

Peptide/	IgG 1	IgG 2	IgG 3/ IgG 4
Glycan	EEQY <u>N</u> STYR	EEQF <u>N</u> STFR	EEQY <u>N</u> STFR/ EEQF <u>N</u> STYR
$N_4H_3$	$830.0^{3+}_{2+}$ [G,B]		
	1244.5 <sup>2+</sup> [G,B,M]		
$N_4H_4$	1325.5 <sup>2+</sup> [G,B]		
$N_4H_5$	938.0 <sup>3+</sup> [G,B]		
$N_4H_6$	992.1 <sup>3+</sup> [B]		
$N_5H_4$		941.0 <sup>3+</sup> [G]	
$N_3H_2F_1$	$1135.0^{2+}$ [M]	2+	
$N_3H_3F_1$	1216.0 [G,B,M]	1200.0 [G,B,M]	
$N_3H_4F_1 \\$	1297.0 <sup>2+</sup> [G,B,M]	1281.0 <sup>2+</sup> [G,B,M]	
NHE	878.7 <sup>3+</sup> [G,B,M]	868.0 <sup>3+</sup> [G,B,M]	873.4 <sup>3+</sup> [G,B]
$N_4H_3F_1$	1317.5 <sup>2+</sup> [G,B,M]	1301.5 <sup>2+</sup> [G,B,M]	1309.5 <sup>2+</sup> [G,B,M]
	932.7 <sup>3+</sup> [G,B,M]	922.0 <sup>3+</sup> [G,B,M]	927.4 <sup>3+</sup> [B]
$N_4H_4F_1$	1398.6 <sup>2+</sup> [G,B]	1382.6 <sup>2+</sup> [G,B,M]	1390.6 <sup>2+</sup> [G,B]
		976.1 <sup>3+</sup> [G,B,M]	
$N_4H_5F_1$	1479.6 <sup>2+</sup> [G,B,M]	$1463.6^{2+}$ [G,B]	
$N_4H_6F_1$	1040.7 <sup>3+</sup> [G]	1030.1 <sup>3+</sup> [G,B]	
	3+	935.7 <sup>3+</sup> [G]	
$N_5H_3F_1$	946.4 <sup>3+</sup> [G,M]	1403.1 <sup>2+</sup> [G,M]	
	3+	989.7 <sup>3+</sup> [G,B,M]	
$N_5H_4F_1$	1000.4 <sup>3+</sup> [G,B]	$1484.1^{2+}$ [G,B,M]	
$N_5H_5F_1$	1054.4 <sup>3+</sup> [G,B,M]	$1043.8^{3+}$ [G,B,M]	
	1054.4 [0,0,10]	1045.8 [0,B,W] 1019.1 <sup>3+</sup> [G]	
$N_4H_4F_1Sa_1\\$		2	
NUEC	3+	1528.1 [G]	
$N_4H_5F_1Sa_1$	1083.8 [G,B]	1073.1 [G,B]	
$N_5H_5F_1Sa_1$	1151.4 <sup>3+</sup> [G,B,M]		C 1 37, 1MS

90 The table shows the detected glycopeptides of glyXtool<sup>MS</sup> 91 [G], Byonic [B] and MAGIC [M]

# 92 CONCLUSION

93 To our knowledge we build the first pipeline engine-94 based N- and O-glycopeptide analysis platform, which 95 supports users in developing their own analysis 96 pipelines based on the data they want to analyze. For 97 this purpose, we provide several glycopeptide-specific 98 tools, which we used to as an example to analyze HCD 99 fragmentation data of human IgG and human 100fibrinogen. The modularity of the pipeline enables fast, 101 flexible, and transparent glycopeptide analysis. Our 102 general approach comprising feature finding, fragment 103 spectrum scoring, and identification should be 104 applicable to most basic glycoproteomic analysis 105 pipelines, and support the implementation of new tools 106 to extend the functionality of glyXtool<sup>MS</sup>. A main 107 strength of the software is the flexible implementation 108 of new tools within the TOPPAS engine. This should 109 allow other research groups to further improve or to 110 tailor the analysis pipeline to their experimental needs 111 by addition or replacement of tools.

Additional tools are needed to provide functionality
like false-discovery rate (FDR) calculation, spectral
matching, and additional scoring algorithms, as
described by other groups.<sup>29,43</sup> Due to the open-source
license, these algorithms can be implemented and
further improved by other workgroups as well.

- 118 The software is available via
- 119 https://github.com/glyXera/glyXtoolMS under the
- 120 GPL-3.0 open-source license.

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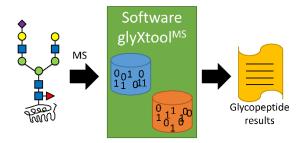
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