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## Glycan–protein interactions determine kinetics of *N*-glycan remodeling†

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A hallmark of *N*-linked glycosylation in the secretory compartments of eukaryotic cells is the sequential remodeling of an initially uniform oligosaccharide to a site-specific, heterogeneous ensemble of glycostructures on mature proteins. To understand site-specific processing, we used protein disulfide isomerase (PDI), a model protein with five glycosylation sites, for molecular dynamics (MD) simulations and compared the result to a biochemical *in vitro* analysis with four different glycan processing enzymes. As predicted by an analysis of the accessibility of the *N*-glycans for their processing enzymes derived from the MD simulations, *N*-glycans at different glycosylation sites showed different kinetic properties for the processing enzymes. In addition, altering the tertiary structure of the glycoprotein PDI affected its *N*-glycan remodeling in a site-specific way. We propose that the observed differential *N*-glycan reactivities depend on the surrounding protein tertiary structure and lead to different glycan structures in the same protein through kinetically controlled processing pathways.

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## Introduction

*N*-Glycoprotein biogenesis in eukaryotes is initiated in the Endoplasmic Reticulum (ER) by the oligosaccharyltransferase, an enzyme complex which covalently links a uniquely defined oligosaccharide, Glc<sub>3</sub>Man<sub>9</sub>GlcNAc<sub>2</sub>, to the side-chain amide nitrogen atom of asparagines within –N–X–S/T–sequons. It thereby modifies a large number of proteins, many of them at multiple sites.<sup>1–4</sup> After the transfer to the protein, processing of the *N*-linked glycans is initiated by ER-localized hydrolases. The removal of the three glucoses is hereby coupled to the folding of the glycoproteins by providing ligands for lectin chaperones such as calnexin or calreticulin.<sup>5,6</sup> The quality control of protein folding relies on glycans and the information they provide about the conformational state of the covalently bound protein.<sup>7</sup>

After the exit from the ER, *N*-glycoproteins are further processed by Golgi specific hydrolases and transferases that generate the final structures of *N*-glycans.<sup>8</sup> This remodeling pathway is characterized by individual reactions that rarely go to completion and the processing of a glycan being different for each site of the glycoproteome. Consequently, a site-specific heterogeneity of *N*-glycan structures is observed. Early on, it was suggested that this differential processing might be due to the tertiary structure of the glycoprotein. In 1984, Savvidou *et al.* hypothesized that the decreased amount of bisecting *N*-glycans on one specific glycosylation site of human IgG was due to specific interactions between this glycan and the protein.<sup>9</sup> In the following, several NMR studies demonstrated interactions between *N*-glycans and the protein surface. They are primarily facilitated by the reducing-end GlcNAc of an *N*-glycan.<sup>10,11</sup> A most recent example of tertiary structure context dependent glycan processing is the discovery that only a single of the eight *N*-glycans in the filamentous urinary glycoprotein uromodulin (UMOD) remains a high-mannose type glycan, while all other *N*-glycans are further processed to complex-type *N*-glycans. It is however the single high-mannose type UMOD glycan that mediates encapsulation and aggregation of uropathogens by UMOD filaments *via* interactions with mannoside-specific pilus lectins from the pathogens.<sup>12</sup> In addition, the rise of computational glycobiochemistry allowed the simulation of glycan–protein interactions<sup>13,14</sup> and indicated that these interactions could reduce the accessibility of the glycan to glycan-processing enzymes.<sup>15</sup> Consequently, glycan–protein interactions are considered a major determinant

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of *N*-glycan microheterogeneity.<sup>15,16</sup> Several studies have used this knowledge to engineer glycoproteins by site-directed mutagenesis. Chen *et al.* introduced new glycan–protein interactions into IgG and could thereby significantly improve the stability of IgG against thermal and low pH induced aggregation.<sup>17</sup> In contrast, site-directed amino acid replacements disrupting interactions between the glycan and the protein lead to improved processing of the “freed” *N*-glycans.<sup>18,19</sup>

Understanding site-specific *N*-glycan processing as it occurs *in vivo* requires a detailed knowledge of the specificity and localization of the individual hydrolases and glycosyltransferases.<sup>20</sup> While being transported from the ER through the *cis*-, medial, and *trans*-Golgi, a glycoprotein encounters a different set of glycan processing enzymes in each compartment for a limited amount of time. Hereby, the product of an enzyme acting earlier in the pathway serves as a substrate for the enzyme acting afterwards.<sup>21</sup> After the removal of the three terminal glucoses in the ER, the  $\alpha$ -1,2-mannosidase ER mannosidase I (ER Man I) removes the terminal mannose from the B-branch of the *N*-glycan resulting in a Man<sub>8</sub>GlcNAc<sub>2</sub> glycan. Even though ER Man I has a high specificity towards this terminal mannose, it is capable of trimming all  $\alpha$ -1, 2-linked mannoses from an *N*-glycan.<sup>22,23</sup> In the Golgi, the glycan is further processed by Golgi Mannosidase I (GM I). This enzyme belongs to the same glycoside hydrolase family as ER Man I (GH 47), and is therefore also able to remove all  $\alpha$ -1,2-linked mannoses from the *N*-glycan. However, in contrast to ER Man I, which *in vivo* performs only one mannose trimming step, GM I completes several trimming steps and removes up to three mannoses from a Man<sub>8</sub>GlcNAc<sub>2</sub> glycan generating a Man<sub>5</sub>GlcNAc<sub>2</sub> glycan.<sup>24</sup> When confronted with a Man<sub>9</sub>GlcNAc<sub>2</sub> glycan, GM I works least efficiently on the terminal B-branch mannose, the preferred mannose of ER Man I.<sup>25</sup>

The product of GM I, a Man<sub>5</sub>GlcNAc<sub>2</sub> glycan, is further processed by *N*-acetylglucosaminyltransferase I (GnT I), which transfers one GlcNAc to the A-branch of the glycan and uses UDP-GlcNAc as a donor substrate.<sup>26</sup> Its action is essential, as the transfer of a GlcNAc initiates the formation of hybrid *N*-glycans (glycans which contain unsubstituted terminal mannose residues as well as mannose residues with a GlcNAc linkage).<sup>27</sup> The generated GlcNAc-Man<sub>5</sub>GlcNAc<sub>2</sub> serves as a substrate for Golgi mannosidase II (GM II) which can cleave two mannoses with different glycosidic linkages ( $\alpha$ -1,3 and  $\alpha$ -1,6 linked), of the B- and the C-branch, with a single catalytic site. First, the  $\alpha$ -1,6-linked, terminal mannose is removed, followed by the  $\alpha$ -1,3 linked mannose.<sup>28,29</sup> By the removal of these two mannoses GM II initiates the synthesis of complex glycan structures (glycans which have added GlcNAc residues at both the  $\alpha$ -3 and  $\alpha$ -6 mannose sites and no more free, terminal mannose residues).<sup>30</sup>

As these above mentioned enzymes, ER Man I, GM I, GnT I and GM II act early in the *N*-glycan processing pathway of the ER and Golgi they generate the glycosubstrates of all following glycan modifying enzymes and are therefore essential for generating the final *N*-glycan structures presented on a protein.

Even though there are multiple publications describing the *in vitro* activity of these enzymes, the majority of these studies

was done on free glycans or glycopeptides.<sup>25,26,29</sup> Therefore, little is known about their activity on a glycoprotein and how the interaction of glycans with the surface of the protein they are attached to influences glycan processing. To answer these open questions, we used yeast protein disulfide isomerase (PDI) as a model protein with five *N*-glycosylation sites to investigate site-specific *N*-glycan processing in the context of an intact glycoprotein.<sup>15</sup> We performed in-depth molecular dynamics (MD) simulations to analyze the dynamics and the interactions of the *N*-linked glycans and experimentally addressed site-specific processing by ER Man I, GM I, GnT I and GM II *in vitro*. Initial velocities and  $K_M$  values demonstrated that the glycan of each glycosylation site represents a unique substrate to glycan-processing enzymes. MD simulations explained the site-specific properties that were primarily determined by protein–glycan and glycan–glycan interactions. Altering the protein structure changed site-specific glycan processing, validating the conclusion that intramolecular protein/glycan interactions slow or even prevent individual steps of glycan processing.

## Results

### Molecular dynamics simulations of PDI

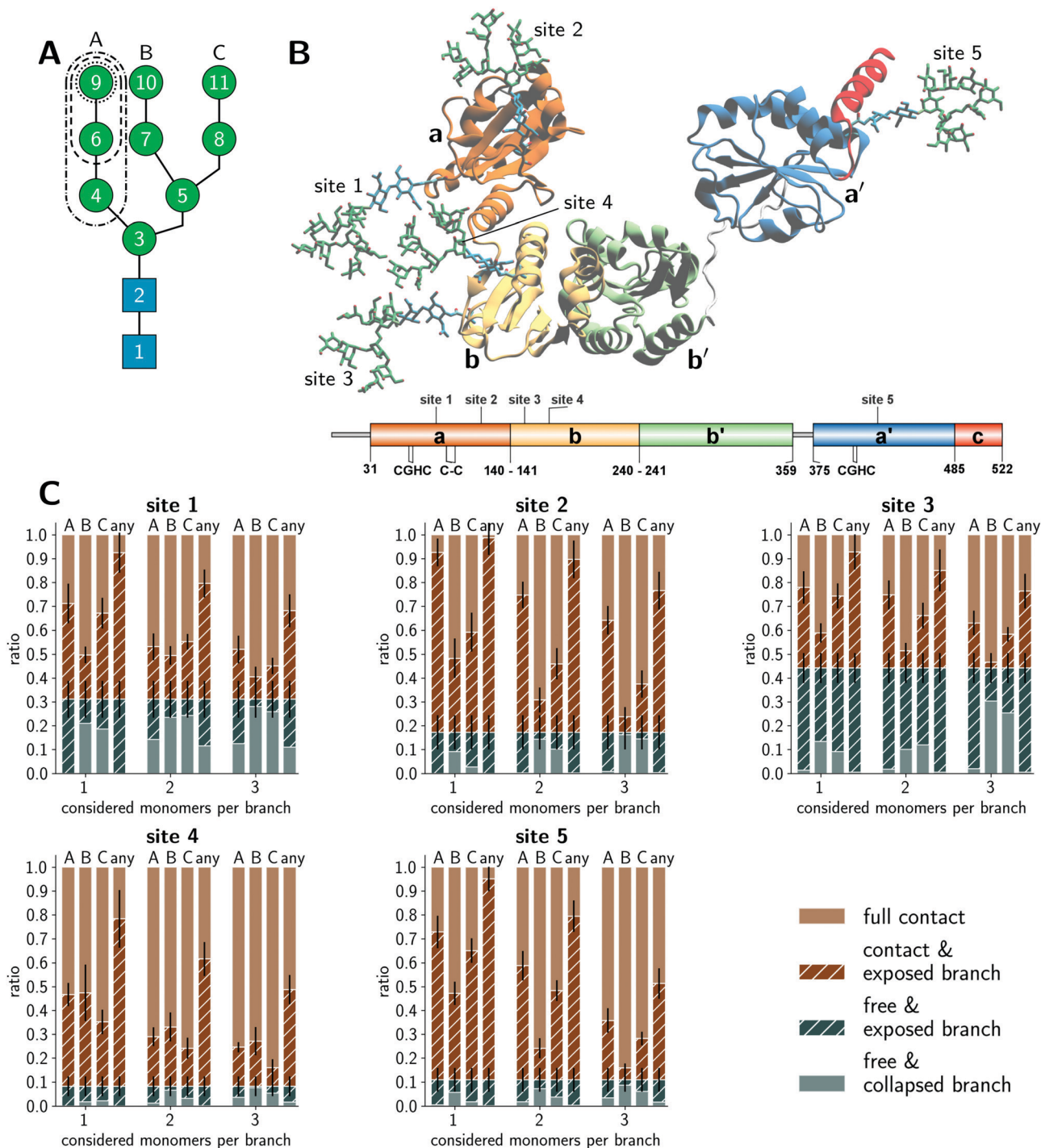
Fig. 1A schematically illustrates the chemical composition of a Man<sub>9</sub>GlcNAc<sub>2</sub> glycan, the most abundant structure bound to the glycosylation sites of PDI in the ER. The U-shaped PDI structure shown in Fig. 1B consists of four thioredoxin-like domains termed a, b, b', and a', of which the domains a and a' possess a catalytic cysteine pair (CGHC in Fig. 1B).<sup>31</sup> Additionally, the a-domain contains a structural disulfide bond (C–C in Fig. 1B). The glycosylation sites 1 and 2 are located on the a-domain, while the b-domain contains sites 3 and 4. Site 5 is distantly located from the other glycosylation sites on the a'-domain.

We conducted explicit-water MD simulations to produce an aggregate sampling of 75  $\mu$ s for the full-length glycoprotein with glycosylated sites 1–4 and 110  $\mu$ s for the a'-domain with glycosylated site 5. In both cases, the aggregate sampling comprises hundreds of individual simulations ranging from 100 ns to 400 ns that were carried out in parallel from different starting configurations. The MD trajectories were partitioned into structural microstates and analyzed using Markov state modeling (MSM),<sup>32,33</sup> typically used to reconstruct thermodynamic and kinetic properties of a simulated ensemble. From the MSM, we retrieved the stationary probability distribution of the structural glycan microstates to quantify the amount of accessible glycan conformations. Further details on the MD simulations, microstate definition, MSM construction, and accessibility assessment are given in the Methods section.

### Conformations of PDI glycans

We distinguished four categories in total for the branch accessibility. The two categories with ‘free’ glycan classification with or without exposed branch(es) were labeled as ‘free & exposed branch’ and ‘free & collapsed branch’, respectively. Exemplifying illustrations are shown in Fig. S1 (ESI<sup>†</sup>). The other two





**Fig. 1** Structural assessment of the site-specific glycan accessibility. (A) Simplified representation of a branched  $\text{Man}_9\text{GlcNAc}_2$  oligosaccharide. The schematic also exemplifies on the A-branch the considered branch lengths for the accessibility assessment when accounting for one (dotted line), two (dashed line), or three monomers (dotted-dashed line). (B) Structure of a  $\text{Man}_9\text{GlcNAc}_2$  glycoform of PDI. The secondary structure of the protein is shown as ribbon representation, the glycans are in a licorice representation with mannose residues in green and *N*-acetylglucosamine residues in blue. The four thioredoxin domains are labeled in different colors (a, orange; b, yellow; b', green; a', blue). The sequence of PDI indicates the three disulfide bonds. The first disulfide bond on the a domain and the one on the a' domain are the active sites of PDI (CGHC). The second disulfide bond on the a domain (C-C) is structural. The glycosite positions are also indicated. (C) Accessibility analysis of the  $\text{Man}_9\text{GlcNAc}_2$  glycans of PDI. The bar plots show the sum of probabilities from the stationary distribution of microstates that are classified as 'free' (blue) and in 'contact' (brown). The striped color refers to 'free' and 'contact' states that have either the A, B, C, or any branch exposed. The abscissa labels the classifications based on one, two, or three branch monomers.



categories differentiate glycan conformations in 'contact' with the protein environment but with or without branch exposure, respectively labeled as 'contact & exposed branch' and 'full contact'. The quantitative classification is described in the Method section. Thus, the classification 'exposed' indicated glycan structures, for which a branch was stretching into the water while the others could still be interacting with the protein, neighboring glycans, or other branches within the same glycan. From the enzymatic point of view, extended glycan conformations are preferred because the catalytic sites in GH47  $\alpha$ -mannosidases, such as ER Man I, are known to be deep funnels binding only one extended branch at a time.<sup>34</sup> Hence, the 'contact & exposed branch' conformations could be more beneficial for the deep binding funnels than the 'free & collapsed branch' conformations.

The accessibility assessment of sites 1–5 is shown in Fig. 1C. Each histogram refers to a given site as labeled above each plot. The histograms are split into the classification of individual A, B, and C branches as well as a separate bar that shows if 'any' branch is accessible. The latter category renders the crudest approach that neglects possible branch selectivity of the maturation. Also, this category clarifies that conformations of individual branches are not exclusive nor additive and at most correlated. Further, the abscissa coordinate labels the number of considered monomers in the accessibility classification. The ordinate gives the occurrence of a given category. Sites 1 and 3 exhibited the largest populations of 'free' conformations (solid + striped blue bars) in which the glycan was barely interacting with its surrounding protein environment or neighboring glycans. Site 2 also showed a clear but reduced fraction of 'free' conformations (solid + striped blue bars) but had a considerable amount of 'exposed' microstates (striped blue + brown bars). Interestingly, a common pattern of 'exposed' branches was shared among sites 1–3 and 5. The 'exposed' microstates were dominated by 'exposed' A-branch conformations, the most flexible branch. A generally minimal exposure of the B branch may be related to its central location within the glycan. Naturally, the percentages of exposed conformations declined when considering an increasing number of monosaccharides per branch (see the abscissa coordinate of each histogram). This gradient was site-specific. In contrast, the same assessment of the glycan on site 4 showed a significantly different pattern. The percentage of 'full contact' conformations (solid brown bar) on site 4 was most dominant across all levels of branch lengths, while the fraction of 'free' conformations (blue bars) was the lowest compared to all other sites. Furthermore, the amount of conformations in which a single branch is completely solvent exposed (*i.e.* 'free & exposed' conformations) was reduced at site 4. Also, the preference of A and C branch exposure over the B branch was lost at site 4, and all three branches had similar fractions of 'exposed' conformations (striped bars). In summary, our glycan-centric, quantitative analysis of the microstates of the MSMs suggested that the  $\text{Man}_9\text{GlcNAc}_2$  was least accessible on site 4. Sites 2 and 5 tended to expose individual branches while they were still in contact with their environment. Sites 1 and 3 exhibited patterns with the comparatively largest

solvent exposure. These observations indicated site-specific differences between the five ( $\text{Man}_9\text{GlcNAc}_2$ ) sites in their reactivity with ER Man I despite their identical chemical structures.

The above analysis of individual glycan conformations was not accounting for the particular contacts and interactions with the glycans' environments that would lead to the 'free', 'contact', and 'exposed' classifications. For instance, as illustrated in Fig. 1B, sites 1 and 3 are in close proximity to each other such that glycan–glycan interactions contributed dominantly to the fraction of 'contact' conformations. Hence, a competition of site 1 and 3 during glycan–enzyme interaction could reduce the trimming of the branches on either site. Fig. 1B shows further that the glycan on site 5 can easily extend to free conformations but potentially forms frequent interactions with the acidic, C-terminal  $\alpha$ -helical PDI segment. Thus, while the amount of free conformations was clearly affected by the glycan–protein interactions at site 5, the individual branches are still exposed during the contact with the neighboring  $\alpha$ -helix. In addition, the protein surface shape is convex at site 2, which is in contrast to a rather concave topology at site 4. These topological differences of the surrounding protein surface pose different glycan–protein contact possibilities (Fig. 1B and Fig. S1, ESI<sup>†</sup>). At site 2, the surrounding protein surface has a positive curvature such that the branches are easily extended when the glycan is 'free' or in 'contact' (Fig. S1, ESI<sup>†</sup>). In contrast, the concave protein surface around site 4 hinders 'exposed' branches in the 'contact' and 'free' conformations.

### *In vitro* processing of PDI *N*-glycans

**Experimental setup.** To experimentally test the predictions offered by the MD simulations, we turned to an *in vitro* biochemical analysis of *N*-glycoprotein processing. We therefore analyzed the kinetics of *N*-glycan maturation processes of the ER and Golgi (Fig. S4A, ESI<sup>†</sup>) by incubating PDI with the *N*-glycan processing enzymes ER Man I, GM I, GnT I, and GM II. The fact that *N*-glycan processing enzymes act on the product of their predecessor causes challenges for the *in vitro* analysis of the above mentioned enzymes, as substrates have to be prepared for each enzyme individually. For the enzymes ER Man I and GM I, the  $\alpha$ -1,2-mannosidase inhibitor kifunensine was added to the cell culture during PDI production to obtain PDI homogeneously glycosylated with  $\text{Man}_9\text{GlcNAc}_2$  on all sites (Fig. S5A, ESI<sup>†</sup>). PDI used in a GnT I assay was pre-incubated with GM I and therefore showed mainly  $\text{Man}_5\text{GlcNAc}_2$  on all sites (Fig. S5B, ESI<sup>†</sup>). For the glycosubstrate generation of GM II, PDI was treated first with GM I followed by incubation with GnT I, yielding mainly  $\text{GlcNAcMan}_5\text{GlcNAc}_2$  on all sites (Fig. S5C, ESI<sup>†</sup>).

After incubation of glycosylated PDI with the respective remodeling enzyme, the site-specific glycoform distributions were obtained by mass spectrometry (MS) of tryptic glycopeptides (Fig. S4B, S6 and S7, ESI<sup>†</sup>).

### Site-specific processing of *N*-glycans by different enzymes

For an initial assessment of site-specific glycan processing enzyme activity, we chose an end-point analysis to determine the optimal time frame the individual enzymes require.



For processing of  $\text{Man}_9\text{GlcNAc}_2\text{-PDI}$  ( $60\ \mu\text{M}$ ) by ER Man I ( $0.3\ \mu\text{M}$ ), we observed efficient conversion (90%) from  $\text{Man}_9\text{GlcNAc}_2$  to  $\text{Man}_8\text{GlcNAc}_2$  for sites 1–3 and 5 within approximately three minutes. In contrast, the glycan from glycosite 4 was processed significantly slower. After 60 minutes only 85% conversion was obtained. On site 2, we additionally observed a decrease of the  $\text{Man}_8\text{GlcNAc}_2$  product after 10 minutes, corresponding to additional mannose trimming by ER Man I (Fig. 2A).

For processing of  $\text{Man}_9\text{GlcNAc}_2\text{-PDI}$  ( $20\ \mu\text{M}$ ) to  $\text{Man}_5\text{GlcNAc}_2$  by GM I ( $0.1\ \mu\text{M}$ ), site 4 again proved to be processed slowest: Only 8% of the site 4 glycans were converted to  $\text{Man}_5\text{GlcNAc}_2$  (in contrast to 80% at sites 2 and 5, Fig. 2B).

The processing of  $\text{Man}_5\text{GlcNAc}_2$  by glycosyltransferase GnT I also proved to be slowest at site 4. After incubation of  $\text{Man}_5\text{GlcNAc}_2\text{-PDI}$  ( $30\ \mu\text{M}$ ) with GnT I ( $0.15\ \mu\text{M}$ ) and UDP-GlcNAc ( $5\ \text{mM}$ ) only about 65% of the site 4 glycans were converted to  $\text{GlcNAcMan}_5\text{GlcNAc}_2$ , while glycans at sites 2 and 3 were converted to about 90% (Fig. 2C). However, to quantify the effect of site 4 being processed slower we next turned to a Michaelis–Menten analysis instead of an endpoint analysis (Fig. 3B).

The largest differences in site-specific remodeling could be observed for GM II (Fig. 2D). Sites 1–3 and 5 of  $\text{GlcNAcMan}_5\text{GlcNAc}_2\text{-PDI}$  ( $20\ \mu\text{M}$ ) reacted to more than 90% to  $\text{GlcNAcMan}_3\text{GlcNAc}_2$  in the presence of GM II ( $67\ \text{nM}$ ) within 60 minutes, while hardly any conversion could be observed on site 4.

Hence, we observed that for all four enzymes, despite being hydrolases or transferases, site 4 was processed slowest.

### Michaelis–Menten analysis of processing kinetics

To quantify the site-specific differences in glycan processing kinetics for the one-step reactions catalyzed by ER Man I and GnT I, we next recorded the dependence of the initial velocity of substrate conversion on PDI concentration at constant processing enzyme concentration (ER Man I:  $0.6\ \text{nM}$ ; GnT I:  $67\ \text{nM}$ ). Site-specific differences in glycosylation site occupancy of PDI (Table S1, ESI<sup>†</sup>) and efficiency of kifunensine treatment (for the ER Man I assay) or GM I treatment (for the GnT I assay) were analyzed by MS in order to calculate the actual concentration of substrate glycan structure per site.

Initial velocities of ER Man I (Fig. 3A) and GnT I (Fig. 3B) for all five sites against PDI concentration were plotted together



**Fig. 2** Site-specific processing of PDI *N*-glycans by four different enzymes. (A) Reaction catalyzed by ER Man I: removal of one  $\alpha$ -1,2-linked mannose from the B-branch of  $\text{Man}_9\text{GlcNAc}_2$ , resulting in  $\text{Man}_8\text{GlcNAc}_2$ .  $\text{Man}_9\text{GlcNAc}_2\text{-PDI}$  was incubated with purified ER Man I, shown is the conversion of  $\text{Man}_9\text{GlcNAc}_2$  to  $\text{Man}_8\text{GlcNAc}_2$  on each site over 60 minutes. Error bars represent the standard deviation of three independent experiments ( $n = 3$ ). (B) reaction catalyzed by GM I: Removal of four  $\alpha$ -1,2-linked mannoses from  $\text{Man}_9\text{GlcNAc}_2$ , resulting in  $\text{Man}_5\text{GlcNAc}_2$ .  $\text{Man}_9\text{GlcNAc}_2\text{-PDI}$  was incubated with GM I, shown is the conversion of  $\text{Man}_9\text{GlcNAc}_2$  to  $\text{Man}_5\text{GlcNAc}_2$  on each site over 180 minutes ( $n = 3$ ). Shown in this graph is only the generation of the final product  $\text{Man}_5\text{GlcNAc}_2$ , a more thorough study of the produced intermediates is shown in Fig. 4A. (C) Reaction catalyzed by GnT I: transfer of a GlcNAc from UDP-GlcNAc to the A-branch of a  $\text{Man}_5\text{GlcNAc}_2$  glycan, resulting in  $\text{GlcNAcMan}_5\text{GlcNAc}_2$ .  $\text{Man}_5\text{GlcNAc}_2\text{-PDI}$  was incubated with purified GnT I and UDP-GlcNAc. Shown is the conversion of  $\text{Man}_5\text{GlcNAc}_2$  to  $\text{GlcNAcMan}_5\text{GlcNAc}_2$  over 80 minutes ( $n = 3$ ). (D) Reaction catalyzed by GM II: removal of a  $\alpha$ -1,3-linked mannose from the B-branch and a  $\alpha$ -1,6-linked mannose from the C-branch of a  $\text{GlcNAcMan}_5\text{GlcNAc}_2$  glycan, resulting in  $\text{GlcNAcMan}_3\text{GlcNAc}_2$ .  $\text{GlcNAcMan}_5\text{GlcNAc}_2\text{-PDI}$  was incubated with purified GM II and shown is the conversion of  $\text{GlcNAcMan}_5\text{GlcNAc}_2$  to  $\text{GlcNAcMan}_3\text{GlcNAc}_2$  on each site over 60 minutes ( $n = 3$ ). Shown in this graph is only the generation of the final product  $\text{GlcNAcMan}_3\text{GlcNAc}_2$ , a more thorough study of the produced intermediates is shown in Fig. 4B.





**Fig. 3** Michaelis–Menten analysis of processing kinetics. (A) Initial velocities of ER Man I are plotted against three different substrate (PDI) concentrations and fitted to Michaelis–Menten kinetics by nonlinear regression (GraphPad Prism software). Error bars represent the standard error of linear regression fits in Fig. S8 (ESI<sup>†</sup>) ( $n = 1$ ). The shaded error on the fit functions are individual fits to the upper and lower limit error range of the measured data points. (B) Initial velocities of GnT I are plotted and fitted like described above for A. (C) Relative initial velocities of ER Man I normalized by initial velocity of site 2. Initial velocities were averaged over three different PDI concentrations. Error bars are calculated by Gaussian error propagation of the shaded fit error in panels A and B. (D) Relative initial velocities of GnT I normalized like described above for C.

with fits according to a Michaelis–Menten mechanism. We observed initial velocities increased with PDI concentrations towards saturation (Tables S2, S3 and Fig. S8, ESI<sup>†</sup>). While the initial velocities of GnT I approached  $v_{\max}$  for all sites, they still increased nearly linearly on site 4 for ER Man I. Consequently, determination of catalytic parameters of ER Man I was not possible for site 4. The data, however, implied that  $K_M$  of ER Man I for site 4 is likely at least one order of magnitude higher than for all the other sites. Also for GnT I, site 4 showed the highest  $K_M$  value (Table 1).

In addition to  $K_M$ ,  $k_{\text{cat}}$  values were calculated for ER Man I and GnT I, showing the highest turnover of substrate molecules on site 1 and 2, respectively. For both enzymes,  $k_{\text{cat}}/K_M$  was highest for site 2, indicating that the glycan from site 2 was the preferred substrate of ER Man I and GnT I.

In order to compare initial velocities between sites, we normalized them by the initial velocity of site 2. These relative

initial velocities were averaged over three PDI concentrations and reveal that the trimming of the oligosaccharide by ER Man I was approximately 10 times slower at site 4 compared to site 2 (Fig. 3C). For GnT I, site 4 reached only about 7% of the initial velocity of site 2 (Fig. 3D).

### Rate constants describing appearance and disappearance of intermediate structures

Since GM I and GM II catalyze multiple, consecutive trimming reactions, each processing step was studied separately by recording the disappearance of the substrate, the transient accumulation of reaction intermediates and the formation of the final product. For fitting the dependence of the concentrations of all species on reaction time, we assigned apparent, first-order rate constants ( $k_1$ – $k_4$ ) to each reaction step as an approximation (Fig. 4A and B).

PDI (20  $\mu\text{M}$ ) was incubated with GM I (0.1  $\mu\text{M}$ ) and glycan processing from  $\text{Man}_9\text{GlcNAc}_2$  to  $\text{Man}_5\text{GlcNAc}_2$ , as well as the appearance and disappearance of all intermediate structures was followed (see Fig. S4A (ESI<sup>†</sup>) for a detailed overview of reactions performed by GM I). Hereby, the conversion of  $\text{Man}_9\text{GlcNAc}_2$  to  $\text{Man}_8\text{GlcNAc}_2$  ( $k_1$ ) occurred with similar kinetics at all sites. In contrast, values for  $k_2$  and  $k_3$  at site 4 were  $\sim 10$ – $20$  fold lower compared to those at the other sites (inset in Fig. 4A and Table S4, ESI<sup>†</sup>), evidenced by the transient accumulation of the  $\text{Man}_8\text{GlcNAc}_2$  and  $\text{Man}_7\text{GlcNAc}_2$  intermediates (Fig. 4A). In addition, the results showed that the conversion of the  $\text{Man}_6\text{GlcNAc}_2$  to the  $\text{Man}_5\text{GlcNAc}_2$  glycoform was rate-limiting for the formation of the final product  $\text{Man}_5\text{GlcNAc}_2$  at all glycosylation sites and occurred 16 to 34 fold slower than the slowest of the other processing steps. Again, site 4 showed the slowest  $\text{Man}_6\text{GlcNAc}_2$  to  $\text{Man}_5\text{GlcNAc}_2$  conversion with  $k_4$  being 4–16 fold lower than the  $k_4$  values at the other sites.

The global fits of  $\text{Man}_9\text{GlcNAc}_2$  processing at sites 1–5 by GM I agreed reasonably well with the experimental data (Fig. 4A). The largest deviations from the fit were observed for the kinetics of formation of the final product  $\text{Man}_5\text{GlcNAc}_2$ . This indicated that the processing mechanism might be more complex than a consecutive 4-step mechanism and might include branch points and parallel pathways.<sup>25</sup>

We therefore extended the reaction mechanism by adding a branch point after  $\text{Man}_7\text{GlcNAc}_2$ , assuming the formation of two different  $\text{Man}_6\text{GlcNAc}_2$  isomers (Fig. S9 and Table S5, ESI<sup>†</sup>).

**Table 1** Apparent kinetic constants ( $\pm$ SEM) of ER Man I and GnT I for the five glycosylation sites of  $\text{Man}_9\text{GlcNAc}_2$ -PDI and  $\text{Man}_5\text{GlcNAc}_2$ -PDI, respectively

		Site 1	Site 2	Site 3	Site 4	Site 5
ER Man I	$v_{\max}$ ( $10^{-9}$ m s <sup>-1</sup> )	3.8 $\pm$ 0.5	3.7 $\pm$ 0.3	2.4 $\pm$ 0.2	ND	2.7 $\pm$ 0.3
	$K_M$ ( $10^{-6}$ M)	8.1 $\pm$ 1.8	5.9 $\pm$ 0.9	9.4 $\pm$ 1.3	ND	7.5 $\pm$ 1.3
	$k_{\text{cat}}$ (s <sup>-1</sup> )	6.3 $\pm$ 0.8	6.2 $\pm$ 0.5	3.9 $\pm$ 0.3	ND	4.4 $\pm$ 0.4
	$k_{\text{cat}}/K_M$ ( $10^6$ M <sup>-1</sup> s <sup>-1</sup> )	0.8 $\pm$ 0.2	1.1 $\pm$ 0.2	0.4 $\pm$ 0.1	ND	0.6 $\pm$ 0.1
GnT I	$v_{\max}$ ( $10^{-9}$ m s <sup>-1</sup> )	6.1 $\pm$ 0.004	31.4 $\pm$ 4.1	17.7 $\pm$ 7.9	3.2 $\pm$ 1.3	14.4 $\pm$ 0.006
	$K_M$ ( $10^{-6}$ M)	13.2 $\pm$ 0.02	38.2 $\pm$ 8.4	52.2 $\pm$ 37.1	70.4 $\pm$ 38.3	25.1 $\pm$ 0.02
	$k_{\text{cat}}$ (s <sup>-1</sup> )	0.1 $\pm$ 0.0001	0.5 $\pm$ 0.1	0.3 $\pm$ 0.1	0.05 $\pm$ 0.02	0.2 $\pm$ 0.0001
	$k_{\text{cat}}/K_M$ ( $10^3$ M <sup>-1</sup> s <sup>-1</sup> )	6.8 $\pm$ 0.1	12.3 $\pm$ 3.9	5.0 $\pm$ 4.5	1.4 $\pm$ 0.5	8.0 $\pm$ 0.1





**Fig. 4** Site-specific processing by GM I and GM II. (A) Consecutive mechanism for the step-wise removal of terminal mannoses from the Man<sub>9</sub>GlcNAc<sub>2</sub> glycans of PDI by GM I. Conversion of Man<sub>9</sub>GlcNAc<sub>2</sub> to Man<sub>8</sub>GlcNAc<sub>2</sub>, Man<sub>8</sub>GlcNAc<sub>2</sub> to Man<sub>7</sub>GlcNAc<sub>2</sub>, Man<sub>7</sub>GlcNAc<sub>2</sub> to Man<sub>6</sub>GlcNAc<sub>2</sub>, and Man<sub>6</sub>GlcNAc<sub>2</sub> to Man<sub>5</sub>GlcNAc<sub>2</sub> is described by apparent rate constants  $k_1$ ,  $k_2$ ,  $k_3$  and  $k_4$ , respectively. Kinetics of glycan processing are shown for each of the five glycosylation sites of PDI individually. Solid lines represent a global fit of the data from each glycosylation site according to the mechanism shown above. Error bars represent the standard deviation of three independent experiments ( $n = 3$ ). (B) Consecutive mechanism for the stepwise removal of terminal mannoses from the GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub> glycans of PDI by GM II. Conversion of GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub> to GlcNAcMan<sub>4</sub>GlcNAc<sub>2</sub> and GlcNAcMan<sub>4</sub>GlcNAc<sub>2</sub> to GlcNAcMan<sub>3</sub>GlcNAc<sub>2</sub> is described by apparent rate constants  $k_1$  and  $k_2$ , respectively.

The corresponding six-parameter fit indeed agreed better with the experimental data, but we consider the results underdetermined, because we could not experimentally distinguish the different Man<sub>6</sub>GlcNAc<sub>2</sub> isomers.

Also, GM II performs multiple mannose trimming steps. It cleaves two mannoses with different glycosidic linkages ( $\alpha$ -1,3 and  $\alpha$ -1,6 linked) in one catalytic site. However, as shown above (Fig. 2D), hardly any conversion of GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub>

to GlcNAcMan<sub>3</sub>GlcNAc<sub>2</sub> could be observed on site 4. To determine the affected mannose trimming step, we measured kinetics of GM II (67 nM) for the processing of the substrate GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub>-PDI (20  $\mu$ M). The data of each glycosylation site was fitted according to a consecutive mechanism with two apparent, first-order rate constants  $k_1$  and  $k_2$  approximating the conversion of GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub> to the intermediate GlcNAcMan<sub>4</sub>GlcNAc<sub>2</sub> and the product GlcNAcMan<sub>3</sub>GlcNAc<sub>2</sub>,



respectively (Fig. 4B). At sites 1–3 and 5, both trimming steps occurred with practically identical rates (inset in Fig. 4B and Table S6, ESI<sup>†</sup>), the substrate was consumed within 30 minutes and the intermediate reached a maximum level of ~30% after five minutes. In contrast, both steps were significantly slower at site 4, with  $k_1$  and  $k_2$  being ~30 fold and 50–100 fold lower compared to the other sites. Consequently, the intermediate had only gradually accumulated to ~30% after 60 minutes of the reaction and virtually no final product GlcNAcMan<sub>3</sub>GlcNAc<sub>2</sub> was produced (Fig. 4B).

### Influence of the protein structure on site-specific mannose trimming

Our atomistic MD simulations revealed an essential role of the tertiary structure context for the site-specific substrate properties of identically composed glycans. PDI contains two catalytic disulfide bonds and one additional, structural disulfide bond (Fig. 1B).<sup>31,35</sup> Nearly complete formation of these disulfide bonds (96%) was confirmed by Ellman assay. To probe the influence of glycoprotein structure on site-specific processing kinetics, we altered the structure of PDI by reducing and subsequently alkylating the three disulfide bonds. The alkylation resulted in slight conformational changes as detected by far-UV circular dichroism (CD) spectroscopy (Fig. 5A). As this structural change was by no means comparable to that occurring upon complete denaturation of PDI with 6 M guanidine hydrochloride, the structure of reduced and alkylated PDI still remained native-like.

Reduced and alkylated as well as native, oxidized Man<sub>9</sub>GlcNAc<sub>2</sub>-PDI (20 μM) was then used as a substrate for GM I (0.1 μM) (Fig. 5B). Site-specific formation of the final product Man<sub>5</sub>GlcNAc<sub>2</sub> was monitored and compared to the respective site on native PDI. We observed that site 4 was processed more efficiently on the reduced and alkylated protein, whereas site 1, 2 and 5 glycans were hydrolyzed slower. For the site 3 glycan, no difference in processing by GM I was observed.

## Discussion

We demonstrated that four different, early in the *N*-glycan maturation pathway acting enzymes (ER Man I, GM I, GnT I and GM II) performed glycan processing at the five sites of PDI with different kinetics. As these enzymes generate the glyco-substrates for all later acting enzymes, they play a crucial role in determining the final glycostructures on PDI. For all the enzymes tested, site 4 was processed the slowest, while sites 2 and 5 were processed most efficiently. This order of reactivity was also observed for the same glycoprotein *in vivo* in insect and CHO cells.<sup>15,19</sup> We therefore concluded that identical glycans at different glycosylation sites presented different substrate properties to the processing enzymes.

We used MD simulations to study the glycan conformations and accessibility on the protein surface in order to explain the site-specific substrate properties of the *N*-linked glycans. The accessibility of 'free' and/or 'exposed' glycan conformations to



Fig. 5 Influence of protein structure on site-specific glycan processing by GM I. (A) Far-UV CD spectra of native, reduced and alkylated, and denatured PDI. Reduction and alkylation of the three disulfide bonds led to a slight change in the structure of PDI. The less pronounced minimum (at 222 nm) and maximum (at 200 nm) indicated a small loss of secondary structure. (B) Reduced and alkylated (dashed line) as well as native (solid line) PDI was incubated with GM I. Shown is the conversion of Man<sub>9</sub>GlcNAc<sub>2</sub> to Man<sub>5</sub>GlcNAc<sub>2</sub> on each site over 180 minutes in comparison to processing of the respective site on native PDI. Error bars represent the standard deviation of three independent experiments ( $n = 3$ ).

processing enzymes exhibited a clear site-specificity. This site-specific substrate availability can be qualitatively compared to the enzyme's particular structure and the specific glycan–enzyme binding modes. For instance, GH47  $\alpha$ -mannosidases typically have a deep and narrow funnel to the catalytic center that binds one glycan branch at a time.<sup>34</sup> Hence, the contacting conformations, which expose only individual branches, may still be accessible for enzyme processing. However, even though the MD simulations provided an in-depth analysis of site-specific branch accessibility, the analytical method (MS) was unable to distinguish between different glycan isomers. Therefore, the *in vitro* assays did not yield information about branch specific processing.

The convex and concave protein surface topologies in the immediate surrounding of sites 2 and 4 (Fig. S1, ESI<sup>†</sup>) represent different presentation platforms of the *N*-glycan that also affect the glycan accessibility. At site 2, the positive protein surface curvature potentially minimizes steric clashes when binding to  $\alpha$ -mannosidase from the GH47 family. In contrast, the concave protein surface around site 4 potentially interferes with binding by the enzyme even though the glycan conformation might not be in contact with the protein surface. Stretched and extended conformations of glycans may be ideally suited for binding in the deep binding pocket of  $\alpha$ -mannosidases. However, at site 4 the steric hindrance of a concave protein surface diminishes



the accessibility of the otherwise 'free' glycan conformations for processing enzymes. At site 2, the combination of a convex protein surface topology and extended glycan branches may be especially advantageous for unhindered glycan–enzyme complexation. This preference of site 2 over site 4 was observed experimentally and we therefore concluded that the substrate properties of *N*-linked glycans as observed by MD simulations reflected their biochemical properties.

An *N*-linked glycan on a convex protein surface represents an ideal substrate for a given enzyme, with the affinity solely determined by the glycan–enzyme interaction. Indeed, for ER Man I and GnT I we found the site 2 glycan to be the preferred substrate (highest  $k_{\text{cat}}/K_{\text{M}}$  value). However, the relative initial reaction rates for the other sites differed between the two enzymes, showing that the interpretation of the 'in contact & exposed' glycan conformations in terms of accessibility as well as the influence of the protein surface topology depends on the exact glycoprotein–enzyme complex. For site 4, we noted a higher  $K_{\text{M}}$  value for both enzymes, indicative for additional protein–glycan interactions due to the concave nature of the protein surface at this glycosylation site. Accordingly, the structural differences of ER Man I and GnT I explain the different site-specific effects on the respective  $K_{\text{M}}$  values.<sup>36,37</sup> When the atomistic details of these complexes will hopefully become available in the future, we anticipate that a quantitative and qualitative analysis of glycans based on MD simulations can be further refined.

We further investigated glycan–protein interactions by reduction and alkylation of PDI. Previously it has been shown that denaturing the glycoprotein soybean agglutinin with 8 M urea improved the processing of its *N*-glycans by ER Man I.<sup>38</sup> However, our data on reduced and alkylated PDI suggest that subtle structural differences can already have site-specific effects: well processed and therefore probably easily accessible *N*-glycans from sites 1, 2 and 5 showed slower processing kinetics upon alkylation. We hypothesize that the change in protein structure featured new interactions, not present in the native PDI, between the glycans from sites 1, 2 and 5 and the PDI surface. For the site 4 glycan, on the other hand the slight change in protein structure improved processing significantly, while there was no effect detectable for site 3.

Within the framework of our hypothesis, folding intermediates in the ER or conformational isomers of folded proteins in the ER and Golgi may represent distinct substrates for site-specific glycan processing in kinetically controlled processing pathways. The differential processability of a defined *N*-linked glycan might even display the folding status of the covalently linked protein in processes such as the quality control pathway of protein folding in the ER.<sup>5</sup>

Our detailed biochemical analysis allowed us to follow enzymes that perform multiple processing steps like GM I and GM II. We identified the rate-limiting step in trimming of a  $\text{Man}_9\text{GlcNAc}_2$  to  $\text{Man}_5\text{GlcNAc}_2$  by GM I to be the last step ( $\text{Man}_6\text{GlcNAc}_2$  to  $\text{Man}_5\text{GlcNAc}_2$ ). Lal *et al.* argued that the last mannose trimmed by GM I is the terminal mannose from the B-branch of the glycan, which is *in vivo* trimmed in the ER by ER Man I.<sup>25</sup> In case of PDI, this last trimming step was greatly impaired on site 4.

Trimming of two mannoses from  $\text{GlcNAcMan}_5\text{GlcNAc}_2$  by GM II is an essential step in the conversion of hybrid to complex *N*-glycans.<sup>39</sup> Our analysis showed that GM II has, compared to the other enzymes tested, the lowest activity on site 4 with a decrease in activity of two orders of magnitude relative to the other sites, which explained why a secreted version of PDI produced in CHO cells showed the highest percentage of hybrid glycan structures on site 4.<sup>19</sup> However, our analysis showed that GM II was able to process the site 4 glycan to some degree, indicating a time and/or enzyme-limited process *in vivo*.

The eukaryotic secretory pathway is organized such that glycoproteins are exposed for a limited time to processing enzymes located in different compartments of the pathway.<sup>21,40,41</sup> Therefore, site-specific initial processing velocities are a determining factor for *N*-glycan processing *in vivo*, together with the residence times of glycoproteins in the individual compartments of the secretory pathway. In such a kinetically controlled system, small alterations of enzyme levels, as observed for example during cellular differentiation in a multicellular organism, can have strong qualitative and quantitative effects on the glycoproteome. Site-specific glycan structures will be affected differently on proteins with multiple glycosylation sites. Therefore, a quantitative glycoproteomics analysis will become a necessity in order to understand the functional properties of glycoproteins.

## Material and methods

### MD simulations

The crystal structure from the Protein Data Bank (PDB: 2B5E<sup>31</sup>) was used as template for PDI. The simulations with the full-length PDI glycoprotein were prepared to account for the flexible nature of the glycans and the protein. The glycoprotein conformations were pre-sampled with the REST2 Hamiltonian replica exchange method<sup>42</sup> as described in Section S1 (ESI<sup>†</sup>). The enhanced conformational sampling was used in two ways: (i) construction of an optimized triclinic box size<sup>43</sup> as described in Section S2 (ESI<sup>†</sup>), and (ii) the sampled structures served as starting configurations for the production runs.

All MD simulations were performed using the GROMACS 2018 simulation software.<sup>44</sup> The AMBER ff99SB-ILDN force field<sup>45</sup> was used for the protein and the GLYCAM06h force field<sup>46</sup> for the glycans. One setup contained the full-length PDI protein with  $\text{Man}_9\text{GlcNAc}_2$  glycans attached at Asn82 (site 1), Asn117 (site 2), Asn155 (site 3), and Asn174 (site 4). This setup was solvated in 63 000 TIP5P water molecules<sup>47</sup> in the optimized box (see Section S2, ESI<sup>†</sup>), and 42 sodium ions<sup>48</sup> were added to neutralize the system. The choice of the TIP5P water model in combination with the original GLYCAM06h force field parameters was based on the findings in ref. 49–51. A second setup only contained the a'-domain with a  $\text{Man}_9\text{GlcNAc}_2$  glycan at Asn425 (site 5), starting from residue Lys366, which was capped by a *N*-Me amide group. This setup was solvated by 12 000 TIP5P water molecules in a 6.4 nm × 6.4 nm × 9.5 nm rectangular box such that the glycan was pointing along



the z-direction. For system neutralization, this setup contained 11 sodium ions.<sup>48</sup>

All MD simulations were performed using the leapfrog integrator<sup>52</sup> with a step size of 2 fs. The solute coordinates were stored every 20 ps. The enhanced sampling and production protocols were carried out under an isothermal–isobaric (*NPT*) ensemble with periodic boundary conditions. The temperature was kept constant at  $T = 300$  K using the V-rescale thermostat<sup>53</sup> with a coupling time of 0.1 ps. The pressure was kept constant at 1 bar using the Parrinello–Rahman barostat<sup>54</sup> with a coupling time of 2 ps and a compressibility of  $4.5 \times 10^{-5} \text{ bar}^{-1}$ . The Verlet cutoff-scheme<sup>55</sup> was applied for non-bonded interactions with a cutoff of 1.0 nm, a neighbor list update frequency of 20 fs, and a buffer tolerance of  $10^{-4}$ . The smooth particle mesh Ewald method<sup>56</sup> with a grid spacing of 0.16 nm and interpolation order of four was used for long-range electrostatics. The SHAKE algorithm<sup>57</sup> was applied to rigidify all bonds.

For the exhaustive sampling of the glycoprotein ensemble, random frames were chosen from the REST2 replica trajectory at  $T = 300$  K. The glycans in these conformations were removed and new Man<sub>9</sub>GlcNAc<sub>2</sub> glycans were attached using the doGlycans tool.<sup>58</sup> These glycan starting conformations were randomly varied within the thermodynamically most stable configurations. The thermodynamically most stable glycosidic bond dihedral angles were taken from ref. 59 and randomly varied within a range  $\pm 40^\circ$  upon a particular MD starting setup. The generated glycoprotein conformations were solvated in the previously optimized box. The first 10 ns of the simulations were discarded as equilibration. The final production trajectories ranged from 100 ns to 400 ns. Multiple trajectories starting from diverse initial configurations were produced to obtain an aggregate sampling of 75  $\mu\text{s}$  and 110  $\mu\text{s}$  for the full-length PDI and the a'-domain setup, respectively.

### Markov state modeling

Inverse distances of glycan residues to vicinal hexoses and amino acids (with hydrogen bond donating/accepting side chains) were chosen as features for the MSMs, as described before.<sup>13,14</sup> Each glycan was individually analyzed using a site-specific choice of considered neighboring glycans and protein surface residues for the (inverse) distance calculations (Table S7, ESI†). For the distances involving hexoses, the respective O5 atom positions were taken. For amino acids, a side-chain specific atom position was considered (listed in Table S8, ESI†). Note that in contrast to the previous MSMs of glycoproteins,<sup>13,14</sup> where very few features were manually selected for the sake of modeling ease, our featurization includes all spatially reachable amino acid and carbohydrate moieties.

In the next step, a dimensionality reduction was performed using the principal component analysis (PCA) and choosing the first ten dimensions ( $n = 10$ ). Subsequently, the hierarchical volume-scaled common nearest neighbor (vs-CNN) clustering algorithm was used to discretize the trajectory into conformational microstates, *i.e.* clusters.<sup>60</sup> We started by finding an initially large cutoff  $R_0$ , such that 99% of the data was clustered, while the similarity  $N = 10$  was fixed. For sites 1–5 different values were respectively obtained for  $R_0 = \{1.4, 1.2, 1.4, 1.4, 1.0\}$ .

Next, the cutoff was decreased in steps of  $R_{i+1} = R_i e^{-\beta \Delta F/n}$  where  $\Delta F$  is the free energy difference between hierarchical levels and  $\beta = 1/k_B T$  with  $k_B$  as Boltzmann constant. Several hierarchical trees were tested using the parameter values  $\Delta F = \{0.6, 0.8, 1.0, 1.2, 1.5, 2.0\} k_B T$ . In each step  $i$ , a given cluster of minimum size  $N_{\text{split}}$  was updated if it was split into at least two new clusters of minimum size  $N_{\text{keep}}$ . These parameters were chosen as pairs from  $N_{\text{split}} = \{101, 1001\}$  and  $N_{\text{keep}} = \{11, 101, 1001\}$ , while  $N_{\text{split}} \geq N_{\text{keep}}$  was ensured. The transition matrix of a particular microstate state-space was estimated using milestoning in the maximum likelihood estimation from the PyEMMA package.<sup>33</sup> Since density-based clustered data was previously shown to improve the Markovian assumption for core-set MSM building,<sup>61–63</sup> a lag time of 100 ps could be chosen in this work. The major quantity obtained from the MSM is the stationary probability  $P_i$  of microstate  $i$  contained in the first eigenvector of the transition probability matrix.<sup>61–63</sup>

### Accessibility assessment

For each microstate the glycan conformations were quantified by the solvent accessible surface area (SASA)  $A_{\text{solv}}$ , the number of hydrogen bonds  $N_{\text{h}}$ , and the number of atomic contacts  $N_{\text{c}}$  with the site-specific glycoprotein environment. The SASA was determined using the Shrake–Rupley algorithm implementation in MDTraj.<sup>64,65</sup> The probe sphere radius was set to 1.4 Å and 960 points were used to represent the surface of an atom. For the hydrogen-bond count  $N_{\text{h}}$ , a geometric criterion of 0.35 nm donor–acceptor distance and a hydrogen-donor–acceptor angle of  $30^\circ$  was used. For consistency, the contact criterion for  $N_{\text{c}}$  also involved an atomic distance threshold of 0.35 nm. During the hydrogen bond and contact analysis of a given mannose residue, the direct neighboring mannoses were excluded. Also, the hydrogen bond count was subtracted from the number of atomic contacts for each frame to avoid double counting.

The above quantities were averaged across the conformations in a microstate  $i$  for each mannose  $k$ ,  $l$ , and  $m$  of branch  $Y$ , such as,  $k = 9$ ,  $l = 6$ , and  $m = 4$  of branch A (see Fig. 1A). The average of the full length of branch  $Y$  was the sum  $\langle \cdot \rangle_{Y,i} = \langle \cdot \rangle_{k,i} + \langle \cdot \rangle_{l,i} + \langle \cdot \rangle_{m,i}$ . Generally, varying lengths of the branches could be compared whilst taking one  $\{k\}$ , two  $\{k, l\}$ , or three  $\{k, l, m\}$  monosaccharides into account. In the remainder, we use the subscripts in the notation for the average  $\langle \cdot \rangle_{Y,i}$  only if required.

To quantify the accessibility or exposure of a given monosaccharide in a glycan branch, the exposure score  $s_x$  ( $x$ -score) was defined as the combination of the individual measures as follows,

$$s_x = \frac{\langle A_{\text{solv}} \rangle}{\langle N_{\text{h}} \rangle \cdot \langle N_{\text{c}} \rangle}$$

where  $\langle A_{\text{solv}} \rangle$  is the average SASA value,  $\langle N_{\text{h}} \rangle$  the average number of hydrogen bonds, and  $\langle N_{\text{c}} \rangle$  the average number of contacts. The  $x$ -score was calculated for each glycan branch separately, considering the varying length of the branches.



We classified 'free' and 'contact' microstates *via* the number of atomic contacts across all full-length glycan branches, *i.e.*,  $N_c^{\text{tot}} = \langle N_c \rangle_A + \langle N_c \rangle_B + \langle N_c \rangle_C$ . For a given threshold  $N_c^{\text{thresh}} < N_c^{\text{tot}}$  the glycan conformations within the microstate were considered in 'contact'. Hence, for  $N_c^{\text{thresh}} \geq N_c^{\text{tot}}$  the glycan conformations of the microstate were considered to be 'free'. Additionally, branch *Y* with *x*-score  $s_x^Y$  in a given microstate was considered 'exposed' if for a given threshold  $s_x^{\text{thresh}} < s_x^Y$ . In combination with the MSMs, the relative abundance of particularly classified conformations was calculated as the ensemble average based on the stationary probability distribution from the MSMs. For example, the fraction of exposed conformations is  $P_{\text{exposed}} = \sum_i P_i \Theta(s_x^{Y,i} - s_x^{\text{thresh}})$  where  $\Theta(x)$  is the

Heaviside step function. Also, combinations of 'free' and 'contact' with the 'exposed' classifications, respectively, were considered, as  $P_{\text{contact\&exposed}} = \sum_i P_i \Theta(s_x^{Y,i} - s_x^{\text{thresh}}) \Theta(N_c^{\text{tot},Y,i} - N_c^{\text{thresh}})$ . These ensemble averages and their standard deviation of microstate classification were calculated over several MSMs, *i.e.*, stationary probability distributions  $P_i$  from the different clustering results (section Markov state modeling), and varying threshold values of  $N_c^{\text{thresh}} = \{[3, 5, 7, 9]\}$  and  $s_x^{\text{thresh}} = \{[1.0, 1.25, 1.5, 1.75, 2.0]\}$ .

### Constructs

From the PDI expression construct pRG85,<sup>15</sup> the C-terminal sequence "LELQLEHDEL" was removed by using the primers prHI\_14\_fw and prHI\_15\_rev (Table S9, ESI†). PCR was performed with Phusion polymerase (Thermo Fisher) and phosphorylated primers. PCR products were ligated with T4 ligase (NEB). The resulting plasmid (pRG85\_CM) was transformed into DH5 $\alpha$  *E. coli* cells. Baculovirus stocks for secreted, N-terminally His<sub>8</sub>-tagged, human glycan processing enzymes ER Man I (MAN1B1), GM I (MAN1A2) and GnT I (MGAT1) were obtained from the glycoenzyme repository <http://glycoenzymes.ccr.cuga.edu/>.<sup>66</sup> Purified, recombinantly produced *Drosophila melanogaster* Golgi Mannosidase II ( $\alpha$ -Man-II a) was kindly provided by Dr Douglas Kuntz from the University of Toronto.<sup>67</sup>

### Production and purification of substrate PDI

Recombinant bacmids containing the gene of interest (PDI) were generated according to the Baculovirus Expression system manual (Thermo Fisher Scientific, Cat. No. 10359016). In brief, DH10Bac *E. coli* cells (Thermo Fisher, Cat. No. 10361-012) were transformed with pRG85\_CM and bacmid DNA was subsequently isolated and used to transfect Sf21 cells (Thermo Fisher, Cat. No. 11497013) using the Cellfectin™ II reagent (Thermo Fisher, Cat. No. 10362100). Recombinant viruses were harvested after 72 hours from the supernatant. Expression and purification of PDI was done as described by Hang *et al.*<sup>15</sup> Briefly, High-Five™ cells (Thermo Fisher, Cat. No. B855-02) were infected with the virus stock. For homogeneously glycosylated PDI (Man<sub>9</sub>GlcNAc<sub>2</sub> on all sites) 10  $\mu$ M  $\alpha$ -1,2-mannosidase inhibitor kifunensine (Sigma-Aldrich Chemie GmbH, Cat. No. K1140) was added to the cell culture. After 48 hours, cells were

lysed and the His<sub>10</sub>-tagged PDI was purified using Ni-NTA beads (Protino, Cat. No. 745400.100). Purified PDI was buffer exchanged to the activity buffer required by the enzyme used in the assay. PDI concentration was determined using the Nano-Drop UV-Vis spectrophotometer (Thermo Fisher). For storage, PDI was flash-frozen in liquid nitrogen and kept at  $-80$  °C. Fig. S10 (ESI†) shows that freezing and thawing of PDI had no influence on the site-specific processing of its *N*-glycans.

### Production and purification of glycan processing enzymes

High-Five™ cells were infected with recombinant baculovirus stocks for either ER Man I, GM I or GnT I like described before for PDI. After 72 hours, the cell culture was centrifuged at 3500 rcf for ten minutes, supernatants were filtered using 0.22  $\mu$ m filters (TRP, Cat. No. 99722) and enzymes were purified *via* their His-tag. Therefore, 1 ml of Ni-NTA beads per 50 ml supernatant were washed three times with 10 column volumes (CV) phosphate buffered saline (PBS) and subsequently mixed with the supernatant. Batch binding was done on a spinning wheel for three hours at 4 °C. The bound fraction was transferred to a gravity flow column (Macherey-Nagel, Cat. No. 745250.10) and washed with 15 CV washing buffer (25 mM imidazole in PBS, adjusted with HCl to pH 7). Elution was done with 4 CV of elution buffer (250 mM imidazole in PBS, pH 7). Purified enzymes (Fig. S11, ESI†) were buffer exchanged to PBS with 10% Glycerol (v/v), flash frozen in liquid nitrogen and stored at  $-80$  °C.

### Enzyme *in vitro* assays

All *in vitro* assays were performed with PDI as a substrate and either ER Man I, GM I, GnT I or GM II in an enzyme specific activity buffer (Table S10, ESI†). Immediately after addition of the enzyme to PDI, the reaction mix was incubated at 37 °C and shaken at 500 rpm.

For *in vitro* assays with ER Man I and GM I, PDI purified from High-Five™ cells treated with kifunensine was used as a substrate. PDI therefore showed mainly Man<sub>9</sub>GlcNAc<sub>2</sub> on all sites, presenting a homogenous glycosubstrate for the tested enzyme (Fig. S5A, ESI†).

For the GnT I *in vitro* assay purified PDI (without kifunensine treatment) was pre-incubated over night with the enzyme GM I (enzyme to substrate molar ratio 1:200) at room temperature to hydrolyze glycans (Man<sub>9</sub>GlcNAc<sub>2</sub> to Man<sub>6</sub>GlcNAc<sub>2</sub>) to Man<sub>5</sub>GlcNAc<sub>2</sub>, the glyco-substrate of GnT I (Fig. S5B, ESI†). The GnT I assay was subsequently performed in GnT I activity buffer<sup>68</sup> containing 5 mM of UDP-GlcNAc (Sigma-Aldrich Chemie GmbH).

The substrate preparation for the GM II assay was done by successively incubating PDI (without kifunensine treatment) with two glycan processing enzymes. First with GM I (enzyme to substrate molar ratio of 1:300) for four hours at 37 °C to obtain mainly Man<sub>5</sub>GlcNAc<sub>2</sub> on all sites. After buffer exchange to GnT I activity buffer, 5 mM of UDP-GlcNAc and purified GnT I in an enzyme to substrate molar ratio of 1:300 was added to the reaction mix. After four hours of incubation at



37 °C PDI showed mainly GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub> on all sites (Fig. S5C, ESI†).

At indicated time points, samples containing a minimum of 50 µg of PDI were taken. To stop the reaction each aliquot was mixed with trichloroacetic acid (15% final concentration) and kept on ice for five minutes. PDI was subsequently pelleted, washed and stored as described by Hang *et al.*<sup>15</sup>

### Sample preparation and MS measurement

Protein pellets were dissolved in 50 µl of 8 M Urea and loaded onto a 30 K centrifugal filter unit (Merck). Preparation for MS was done as described in ref. 69. Briefly, the protein was reduced by 50 mM dithiothreitol and alkylated by 65 mM iodoacetic acid in 0.05 M ammonium bicarbonate buffer (pH 8.5) to facilitate trypsin digestion (trypsin to PDI weight ratio 1 : 50) at 37 °C for 16 h. For analysis of glycosite occupancy, Trypsin digest of PDI was followed by digestion of *N*-glycans with *endo*-β-*N*-acetylglucosaminidase H (500 U; NEB) in sodium citrate buffer (50 mM, pH 5.5) at 37 °C for 40 hours.<sup>70</sup> Peptides were collected by centrifugation and desalted by Zip-Tip C18. For analysis, samples were dissolved in 2% acetonitrile with 0.1% formic acid and analyzed by one of the two methods described below.

Either by a calibrated LTQ-Orbitrap Velos mass spectrometer (Thermo Fischer) coupled to an Eksigent-Nano-HPLC system (Eksigent Technologies) like described in ref. 15.

Alternatively, by a calibrated Q Exactive™ mass spectrometer (Thermo Fischer) coupled to a Waters Acquity UPLC M-Class system (Waters) with a Picoview™ nanospray source 500 model (New Objective). Samples were loaded onto a Acclaim PepMap 100 trap column (75 µm × 20 mm, 100 Å, 3 µm particle size) and separated on a nanoACQUITY UPLC BEH130 C18 column (75 µm × 150 mm, 130 Å, 1.7 µm particle size), at a constant flow rate of 300 nl min<sup>-1</sup>, with a column temperature of 50 °C and a linear gradient of 1–35% acetonitrile/0.1% formic acid in 42 min, followed by a sharp increase to 98% acetonitrile in 2 min and then held isocratically for another 10 min. One scan cycle comprised of a full scan MS survey spectrum, followed by up to 12 sequential HCD scans based on the intensity. For glycosylation profiling analysis, full-scan MS spectra (800–2000 *m/z*) were acquired in the FT-Orbitrap at a resolution of 70 000 at 400 *m/z*, while HCD MS/MS spectra were recorded in the FT-Orbitrap at a resolution of 35 000 at 400 *m/z*. HCD MS/MS spectra were performed with a target value of 5 × 10<sup>5</sup> by the collision energy setup at a normalized collision energy 22.

### Glycoform quantification

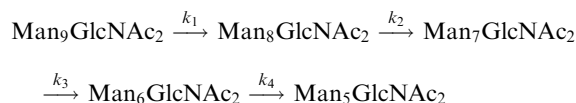
Spectra obtained were analyzed with XCalibur 2.2 sp1.48 (Thermo Fisher) like described previously.<sup>15</sup> For quantification, extracted ion chromatography of all glycoforms were plotted by their unique mass over charge (*m/z*) ratio, based on a previous study by Losfeld *et al.* (Table S11, ESI†).<sup>19</sup> Peak area was defined manually and integrated by the program. The relative amount of each glycoform located on the same peptide backbone was

calculated as shown before by Hang *et al.*<sup>15</sup>

$$\text{Relative amount of glycoform (\%)} = \frac{\text{Peak area of glycoform}}{\text{Sum of peak areas of all glycoforms}} \times 100\%$$

### Kinetics of site-specific glycan processing by GM I and GM II

For GM I, the glycan processing kinetics of each site were globally fitted using Dynafit<sup>71</sup> according to the following consecutive mechanism



where the apparent rate constants  $k_1$ ,  $k_2$ ,  $k_3$  and  $k_4$  describe the consecutive trimming of one terminal mannose residue from the PDI-Man<sub>9</sub>GlcNAc<sub>2</sub> substrate. For GM II, the glycan processing kinetics of each site were globally fitted using OriginPro 2018b (OriginLab) according to the 2-step consecutive mechanism



where  $A$ ,  $B$  and  $C$  represent PDI-GlcNAcMan<sub>5</sub>GlcNAc<sub>2</sub>, PDI-GlcNAcMan<sub>4</sub>GlcNAc<sub>2</sub> and PDI-GlcNAcMan<sub>3</sub>GlcNAc<sub>2</sub>. The fractions of these glycoforms are then given by

$$A = e^{-k_1 t}$$

$$B = \frac{k_1}{k_2 - k_1} (e^{-k_1 t} - e^{-k_2 t})$$

$$C = 1 + \frac{1}{k_1 - k_2} (k_2 e^{-k_1 t} - k_1 e^{-k_2 t}).$$

The apparent rate constants  $k_1$  and  $k_2$  were shared among the three datasets of each glycosylation site.

### Reduction and alkylation of PDI

Reduction and alkylation of PDI was done as described earlier for preparation of proteins for MS.<sup>69</sup> The alkylation of cysteines was highly efficient as only alkylated peptides were detected by MS.

### Circular dichroism

To determine if reduction and alkylation of the protein changed the protein structure, far-UV circular dichroism (CD) spectra were recorded. PDI was purified from kifunensine treated High-Five™ cells. To increase purity of the PDI sample two additional purification steps on a Basic Äkta module (Amersham Biosciences) were introduced. First, PDI (in PBS, pH 7) was submitted to size exclusion chromatography on a Superose™ 12 10/300 GL column (GE Healthcare, Cat. No. 17-5173-01) at a flow rate of 0.5 ml min<sup>-1</sup> with PDI eluting between 11 and 14 ml.

In the second step, hydrophobic interaction chromatography using a Hi-Trap Butyl-Sepharose column (GE Healthcare, Cat. No. 28411001) with a flow rate of 1 ml min<sup>-1</sup> and a



gradient from 0.9 M (NH<sub>4</sub>)<sub>2</sub>SO<sub>4</sub> in PBS to PBS over 5 CV was performed. The peak eluting between 16 and 22.5 ml was collected, and buffer exchanged to PBS.

Far-UV CD spectra of oxidized native, reduced and alkylated and denatured oxidized PDI (with 6 M guanidine hydrochloride) were recorded at a protein concentration of 0.4 mg ml<sup>-1</sup> in PBS, pH 7.0 at 25 °C using a temperature-controlled J715 CD spectrometer (Jasco). CD signals were converted to mean residue ellipticity as described by Schmid *et al.*<sup>72</sup>

## Author contributions

MA and SR designed the research. MEL, CM, and RGW designed the experiments and simulations. CM and CG performed the experiments. RGW performed the simulations. CM, RGW, CG, RG and CWL analyzed the data. CM, RGW, CG, RG, SR, and MA wrote the manuscript. All authors read and approved the final manuscript.

## Conflicts of interest

The authors declare that they have no conflict of interest.

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