**Tissue glycomics distinguish tumour sites in women with advanced serous adenocarcinoma**

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In the era of precision medicine, the tailoring of cancer treatment is increasingly important as we transition from organ-based diagnosis towards a more comprehensive and patient-centric molecular diagnosis. This is particularly the case for high-grade serous adenocarcinomas of the ovary and peritoneum, which are commonly diagnosed at an advanced stage, and collectively treated and managed similarly. We characterized the N- and O-glycome of serous ovarian (OC) and peritoneal cancer (PC) tissues using PGC-LC-ESI-IT-MS/MS profiling and validated the discriminatory glycans and their corresponding glyco-gene expression levels using cell lines and transcriptomic data from 232 patients. Overall, the N- and O-glycan repertoires of both cancer types were found to comprise mostly of α2,6-sialylated glycans, with the majority of N-glycans displaying the biantennary mono- and disialylation as well as bisecting-type biantennary glycans. The MS profiling by PGC-LC also revealed several glycan structural isomers that corresponded to LactdiNAc-type (GalNAcβ1-4GlcNAc) motifs that were unique to the serous ovarian cancers and that correlated with elevated gene expression of B4GALNT3 and B4GALNT4 in patients with serous cancer. Statistical evaluation of the discriminatory glycans also revealed 13 N- and 3 O-glycans (P < 0.05) that significantly discriminated tumour-sampling sites, with LactdiNAc-type N-glycans (m/z 1205.0512 and m/z 1059.4240) being associated with ovarian-derived cancer tissue and bisecting GlcNAc-type (m/z 994.9470) and branched N-glycans (m/z 1294.0242 and m/z 1148.4283) upregulated at the metastatic sites. Hence, we demonstrate for the first time that OC and PC display distinct molecular signatures at both their glycomic and transcriptomic levels. These signatures may have potential utility for the development of accurate diagnosis and personalized treatments.

**Abbreviations**
BPC, base peak chromatogram; EIC, extracted ion chromatogram; ESI, electrospray ionization; FIGO, International Federation of Gynecology and Obstetrics; Fuc, L-fucose; Gal, D-galactose; GalNAc, 2-acetyl-D-galactosamine; Glc, D-glucose; GlcNAc, N-acetyl-D-glucosamine; GLM, generalized linear model; HGSC, high-grade serous cancer; IT, ion trap; LactdiNAc, N,N'-diacetyl-lactosamine; LC, liquid chromatography; Man, D-mannose; MS, mass spectrometry; Neu5Ac, N-acetyl-neuramic acid; OC, high-grade serous ovarian cancer; PC, high-grade serous peritoneal cancer; PGC, porous graphitized carbon; RF, random forest.
1. Introduction

Epithelial ovarian cancer has the highest mortality rate of all gynaecological malignancies, because more than 75% of tumours are diagnosed at an advanced FIGO (International Federation of Gynecology and Obstetrics) stage (III and IV) (Coleman et al., 2011) where the 5-year survival rate is only 20% (Fishman and Bozorgi, 2002; Ozols, 2006). Compared to many other solid cancer types, the prognosis for ovarian cancer has changed little since platinum-based treatment was introduced more than 30 years ago (Vaughan et al., 2011). Epithelial ovarian cancer is a heterogeneous group of cancers, classified primarily on their histopathological features (serous being the most common subtype) and location of the primary tumour mass (Kurman and Shih Ie, 2010; Scully et al., 1998). Serous ovarian and peritoneal tumours are believed to be frequently derived from the fallopian tube, may not be distinguishable preoperatively (Barda et al., 2004), display a similar genetic predisposition (BRCA mutations) (Bandera et al., 1998a,b) and commonly present with widespread dissemination within the pelvis and abdomen (Kessler et al., 2013; Seidman et al., 2011). Despite being treated identically, there is a debate as to whether these cancers are variants of the same malignancy or develop through different pathways. Difficulties in the identification of the site of origin in patients with advanced disease, where the ovary, fallopian tube and the abdominal cavity are all usually involved, plus their macroscopic and microscopic resemblance, are major causes of this debate.

Recent findings suggest that peritoneal and ovarian cancer may be linked to different carcinogenic pathways, with both cancers exhibiting differences in protein expression of Her2/neu, estrogen and progesterone receptors (Sorensen et al., 2015). This is in line with elevated plasma levels of the routinely used clinical biomarkers, HE4 and CA125, in peritoneal compared to ovarian and tubal cancers (Jacob et al., 2011). There is also increasingly epidemiological evidence that peritoneal cancer and ovarian cancer are two distinct diseases (Gao et al., 2016; Rottmann et al., 2017; Schnack et al., 2014). It is evident that studies investigating the underlying differences within these serous cancer subtypes which are reflective of the individual cellular phenotypes and molecular origin have been rather limited (Chen et al., 2003; Lacy et al., 1995; Pere et al., 1998). It has also been shown that a majority of fallopian tubes examined from patients with primary peritoneal cancer have been found with the presence of serous tubal intraepithelial lesions, thereby giving the tumour cells access to the peritoneal cavity (Seidman et al., 2011). Despite the use of high-throughput ‘omics’ technologies that are rapidly increasing, no studies have elucidated the characteristic molecular profiles of these morphologically related cancer tissue samples within this context. Specifically, the degree to which these serous tumours differ, despite their similarity in terms of pathogenesis, clinical behaviour and chemotherapy response, remains to be elucidated.

It has been widely established that protein glycosylation is an important post-translational modification, which has relevance in many biological processes such as cell signalling, immune responses, extracellular interaction and cell adhesion (Cummings and Pierce, 2014). In fact, several studies have elucidated a plethora of cellular- and in vivo tissue-specific glycan patterns on glycoproteins, thereby providing an insight into the specificity of glycosylation activities (Chandrasekaran et al., 2006; Sun et al., 2011). In the tumour microenvironment, aberrant glycosylation has been well documented, with increasing evidence pointing to the role of N- and O-glycans in modulating critical aspects of tumour growth and development as well as metastasis. These structures resemble molecular-level glycomic ‘fingerprints’ which facilitate the discrimination between healthy and diseased states or reflect tumour microheterogeneity caused by the variation within cancer subtypes (Abbott et al., 2010; Christiansen et al., 2014; West et al., 2010). While several studies yielded clinically relevant information on the differential expression of ovarian cancer-associated glycans found in patients’ serum and tissues, the major focus of their analysis was on differentiating between healthy and diseased patients (Abbott et al., 2008; Jacob et al., 2012, 2014a). In regard to cell surface glycosylation, there is still a lack of studies that have utilized glycomics to characterize the specific N- and O-glycan structures within the serous-histotype groups of tumours which likely represent distinct diseases despite still being classified as ovarian cancer.

To address this challenge, we have employed a quantitative MS-based glycomics profiling of plasma membrane N- and O-glycoproteins derived from invasive adenocarcinomas of the ovary and peritoneum. We also sought to identify specific glycotopic features of these serous cancer tissues using porous graphitized carbon (PGC) chromatographic retention and mass spectrometric fragmentation characteristics, and to validate the presence of discriminatory glycans using a combination of statistical classification methods and glyco-gene transcriptomic data derived from an
independent cohort. This comprehensive tissue glycan profiling serves as the first step towards identifying serious cancer glycan biomarkers that may be utilized in diagnostics or further applied to various MS imaging technology platforms for the robust and sensitive discrimination of tumours.

2. Results

Specimens used in this study were diagnosed by pathologists as either high-grade serous ovarian cancer (OC) or peritoneal cancer (PC) based on their corresponding histopathological features. The membrane proteins were extracted from these tissues and the released N- and O-glycan alditols were analysed using negative ion mode PGC-LC-ESI-MS/MS, which resulted in the detection of well-resolved chromatographic peaks that corresponded to specific glycan structures (Everest-Dass et al., 2013a,b). Upon the identification of characteristic glycan features for each serous cancer type, glycan structural profiles were subjected to a series of statistical evaluations to potentially distinguish between serous ovarian and peritoneal cancers. For some of the tissue samples that were analysed, the diagnosis did not correspond to the location from which the tissue was derived; for example, OC specimen was obtained from an omental (omentum) metastasis and not from their corresponding primary cancer location (Table S1). Therefore, we performed two separate statistical analyses in this study: firstly on tissue samples based on diagnosis (OC vs. PC) and secondly, based on the site from where the cancer tissue was derived from (ovary vs. peritoneum vs. omentum). The workflow employed in this study is outlined in Fig. 1.

2.1. The N- and O-glycan repertoires of serous adenocarcinomas

The glycan structures, including their isobaric isomers, were characterized by their retention time and fragment ions and were quantified based on relative integration of their extracted ion chromatographic peaks (Table S2). Their structures were classified into five major glycan types, namely high mannose, hybrid, complex neutral, complex sialylated and paucimannose (Stanley et al., 2009). The representative average summed MS spectra for N-glycans (Fig. 2A) and O-glycans (Fig. 2B) were overall similar, with the majority of the peaks in the global MS profiles of both serous cancer groups typified by sialylated N-glycans, which appeared to be comparable in terms of their relative amounts. Several other peaks comprising neutral and high mannose-type glycans were also observed, appearing at lower intensities. In total, 55
Fig. 2. Representative average MS glycomic profiles of N- and O-glycans released from membrane proteins of serous cancer tissues. (A) An overview of the representative average MS N-glycan profiles in the range of m/z 640–1540 of serous ovarian (S75) and serous peritoneal (S164) cancers (LC elution time: 30–70 min). Structures were depicted according to the Essentials of Glycobiology notation (Varki et al., 2015) with linkage placement for sialic acid and fucose residues (where known). The N-glycan structures were identified by tandem MS and are represented mainly by the doubly charged species ion, m/z [M-2H]^{2-}. Glycan masses containing isomeric structures that were resolved using retention time differences were indicated by asterisks (*). (B) Representative average MS O-glycan profiles in the range of m/z 640–1340 of serous ovarian (S102) and serous peritoneal (L11) cancers (LC elution time: 30–50 min). The O-glycan structures were identified by tandem MS and are represented mainly by the singly charged species ion, m/z [M-H]^{+}. 
distinct N- and nine O-glycan masses were identified (Table S2) across both serous cancers (OC, n = 14 and PC, n = 14) at varying relative abundance. The structures were characterized in detail based on their specific features: (a) sialylation was a major N-glycan feature in both cancer types, ranging between 66.32% and 68.545% of the total N-glycan structures characterized across all samples. Sialylated N-glycans were further classified based on the number of sialic acid residues, in which mono-, di- and trisialylated N-glycans were all observed to be present (Fig. S1A,B). The four most abundant glycan comprised monosialylated (m/z 965.92$^-^-$ and m/z 1038.92$^-^-$) and disialylated (m/z 1111.52$^-^-$ and m/z 1184.53$^-^-$) N-glycans in both cancers (Table S2). Likewise, for the O-glycans, mono- and disialylation was also a prominent feature in both OC and PC cancers. Specifically, core 1 structures with m/z 675.31$^-^-$ [(Neu5Ac)2(Gal)1(GalNAc)1] and m/z 966.31$^-^-$ [(Neu5Ac)2(Gal)1(GalNAc)1] comprised over 75% of the total ion abundance of the O-glycans of OC and PC, respectively (Table S2). Several glycans with structural isomers corresponding to differences in sialic acid linkage were also observed for some of the N-glycan masses. For example, the monosialylated hybrid and complex-type N-glycans with m/z 945.32$^-^-$ and m/z 965.92$^-^-$, respectively, were found as isomers with terminal α2-3- or α2-6-linked sialic acid, which were differentiated based on their chromatographic retention times (Fig. 3Ai-ii). Likewise, the most abundant disialylated N-glycan with m/z 1111.42$^-^-$ was found to comprise three structural isomers, in which the α2,6/α2,6-linked isomeric structure eluted from the column earlier than the remaining two structural isomers containing α2,6/α2,3- and α2,3/α2,3-linked sialic acids, respectively (Fig. 3Ai-ii) (Nakano et al., 2011). The prominence of α2-6 sialylation on membrane proteins of serous tumours analysed in this study correlates with our previous findings reported for ovarian cancer cell lines (Anugraham et al., 2014). In total, 10 sialylated N-glycan masses were found to contain these isomeric structures, in which five of these N-glycans were monosialylated hybrid structures (m/z 783.32$^-^-$, m/z 856.32$^-^-$, m/z 864.32$^-^-$, m/z 937.32$^-^-$ and m/z 945.32$^-^-$), with an α2-6 sialyl linkage, accounting for 58.465–59.864% of the total hybrid-type isomeric structures for both serous cancers (Fig. 3Bi). Likewise, the remaining five isomeric N-glycans were monosialylated (m/z 957.82$^-^-$, m/z 965.92$^-^-$ and m/z 1038.92$^-^-$) and disialylated (m/z 1111.42$^-^-$ and m/z 1184.52$^-^-$) complex-type glycans, which also displayed α2-6 sialylation for approximately 62.217–67.951% (Fig. 3Bii-iii) of the total complex-type isomeric structures in both serous cancer groups.

(b) Biantennary and branched N-glycans – Biantennary N-glycans are formed through the addition of β1-2-linked GlcNAc (N-acetylglucosamine) residues by the enzyme GlcNAcT-II on both the α2-3- and α2-6-linked Man residues of the N-glycan core [(Man)$_n$]((GlcNAc)$_n$), which are typically elongated with a Gal residue to form an antenna on each arm. The assignment of an antenna in this study was performed based on the presence of a complete LacNAc (Gal-GlcNAc) disaccharide. In total, seven N-glycan compositions corresponding to neutral and sialylated biantennary N-glycans were observed in serous cancer tissues, accounting for approximately 53.487–58.587% of the total N-glycans for both OC and PC cancers (Fig. S1C). In regard to the more highly branched N-glycan structures that are synthesized by the enzymes, GlcNAcT-IV and GlcNAcT-V to form β1-4- and β1-6-linked GlcNAc, respectively, eight tri- and three tetra-antennary structures were identified in OC and PC cancers and comprised significantly lower relative abundance as compared to the biantennary N-glycans (P < 0.0001). These structures ranged between 4.402% and 5.704% of the total glycans in both serous ovarian and peritoneal cancers.

(c) Bisecting-type biantennary N-glycans – We also observed the presence of glycan structures corresponding to bisecting-type biantennary N-glycans. In total, there were 10 structures, of which several forms were observed such as the agalactosylated bisecting (m/z 759.92$^-^-$, m/z 840.82$^-^-$ and m/z 913.92$^-^-$), biantennary bisecting (m/z 921.92$^-^-$ and m/z 994.92$^-^-$), monosialylated biantennary bisecting (m/z 986.52$^-^-$, m/z 1059.42$^-^-$, m/z 1067.52$^-^-$ and m/z 1140.42$^-^-$) and disialylated biantennary bisecting (m/z 1286.05$^-^-$) N-glycans that ranged between 6.782 and 6.894% of the total N-glycans in OC and PC (Fig. S1C). A bisecting-type N-glycan is formed when a GlcNAc residue is attached to the innermost mannose of the N-glycan core by the action of a specific enzyme, β1-4-N-acetyl-glucosaminyltransferase III (GlcNAcT-III), encoded by the MGA73 gene. The presence of the ‘bisecting’ GlcNAc group is characterized by a diagnostic D-221$^{-}$ [203 (mass of bisecting GlcNAc) + 18 (H$_2$O)] cleavage which occurs specifically in the negative ion MS mode. This ion can be visualized in the MS/MS fragmentation spectra of biantennary N-glycans as m/z 670.21$^-^-$, which corresponds to the loss of the GlcNAc residue from the D ion (mass of six-arm antennae composition and two remaining branching core Man residues), accompanied by the loss of a water molecule (Fig. S2A–C). In Fig. S2D, the D-221$^{-}$ ion was observed as m/z 508.31$^-^-$, for the agalactosylated N-glycan with m/z 759.92$^-^-$, thereby corresponding to the mass of GlcNAc-Man-Man-18- (H$_2$O). We have previously observed
bisecting-type N-glycans on ovarian cancer cell lines (SKOV3, IGROV1, A23780 and OVCAR3), but not on the normal ovarian epithelium cell lines, HOSE 6.3 and HOSE 17.1 (Anugraham et al., 2014), thereby validating the presence of these structures on serous cancer tissues, as evidenced in this study.

2.2. Elevated LacdiNAc-type N-glycans in ovarian cancer

Despite the overall similarity between OC and PC tissues, a comprehensive MS structural profiling of individual glycan mass signals revealed various glycan masses significantly discriminating both cancer types. In OC samples, five N-glycan compositions corresponding to neutral (m/z 913.92<sup>2</sup> and m/z 934.42<sup>2</sup>) and sialylated (m/z 1059.42<sup>2</sup>, m/z 1079.92<sup>2</sup> and m/z 1205.02<sup>2</sup>) structures were found to contain LacdiNAc (GalNAcβ1-4GlcNAc) motifs, accounting for approximately 2.775 ± 2.005% of the total N-glycans in OC, while only 0.1247 ± 1.312% was found in PC tissues (Table S2, Fig. S3). These LacdiNAc-containing glycan masses were verified by MS/MS fragmentation patterns that differed from their compositional isomers. For instance, the N-glycan mass with m/z 913.92<sup>2</sup> consists of two compositional isomers that were separated...
by the PGC chromatography. The early-eluting isomer contained a bisecting-type glycan of the same composition (Fig. 4i), while the later-eluting isomer displayed the LacdiNAc motif (Fig. 4ii). The presence of the LacdiNAc antenna was deduced by the presence of the B ion at \(m/z\) 405.11 and the 1,3A cross-ring cleavage ion at \(m/z\) 465.11. This ion, also observed in Fig. 4iii, iv, is termed as an ‘F ion’ (Harvey et al., 2008) and has a composition of GalNAc-GlcNAc-O-CH=CH-O-(GalNAc + GlcNAc + 591), which comprises the LacdiNAc disaccharide and two carbon atoms from the branching Man residue. Similarly, the N-glycan with \(m/z\) 1205.02 was found to display antennae containing both the sialylated form of the LacdiNAc (Neu5Ac-GalNAc-GlcNAc) and the sialylated LacNAc (Neu5Ac-Gal-GlcNAc), observed as mass fragments of \(m/z\) 696.21 and \(m/z\) 655.21, respectively, in the MS spectra (Fig. 4v). This complex biantennary structure was present in 93% of OC samples analysed in this study. However, in the PC group, it was only found in 22% of samples.

2.3. The N-glycome discriminates OC from PC

When the relative abundance of each glycan structure was compared between OC and PC, nine N-glycan structures with specific glycan structural feature epitopes were identified to be statistically significant (0.001 < \(P\) < 0.05) (Table 1). Three of these N-glycans \((m/z\) 1205.02, \(m/z\) 1059.42 and \(m/z\) 1079.92)
contained LacdiNAc motifs with terminal sialylation and were found to be significantly increased in OC. Several other N-glycans upregulated in OC comprised of hybrid N-glycans (m/z 937.3^{2+} and m/z 856.3^{2+}) and a bisecting-type sialylated biantennary N-glycan (m/z 1286.0^{2+}). An example of the expression levels of the glycan with sialylated LacdiNAc (m/z 1205.0^{2+}) and a monosialylated hybrid glycan (m/z 937.3^{2+}) in OC compared to PC tissues is shown in Fig. 5A. On the other hand, PC displayed a significant increase in bisecting-type biantennary N-glycan (m/z 994.9^{2+}), galactosylated biantennary N-glycan (m/z 739.3^{2+}) and monosialylated biantennary N-glycan (m/z 1038.9^{2+}) (Table 1). ROC curves were generated for N- and O-glycan relative ion intensities that were significantly altered (P < 0.05) and the resulting AUC was used as an indicator of the test accuracy. Based on the ROC analysis, two individual N-glycan candidates, m/z 1205.0^{2+} (AUC 0.93) and m/z 937.3^{2+} (AUC 0.89), were able to clearly discriminate OC from PC (sensitivity: 86.7%, specificity: 92.3%), while the combination of both glycans revealed a higher AUC value of 0.95 and specificity (100%) (Fig. 5B, Table 1). To further evaluate the discriminatory potential of the N-glycans, we performed RF and GLM classification analysis on the total N-glycans released from the serous cancer tissues. In total, four structures were selected by GLM (m/z 1205.0^{2+}, m/z 937.3^{2+}, m/z 856.3^{2+} and m/z 994.9^{2+}) and RF (m/z 937.3^{2+}, m/z 856.3^{2+}, m/z 739.3^{2+} and m/z 1079.9^{2+}), respectively (Table 1). The corresponding AUC for the four glycan selected by GLM and RF were 0.97 (sensitivity: 93.3%, specificity: 100%) and 0.93 (sensitivity: 86.7%, specificity: 100%), respectively (Fig. 5B). These results indicate that that serous cancers of the ovary and peritoneum can be differentiated based on specific structures in their N-glycan profiles, and more importantly, the selected glycan discriminants can be utilized as a panel of biomarkers to distinguish between these cancers and thus, improve their diagnosis.

2.4. LacdiNAc-type glycans are elevated in ovarian tissue-derived serous adenocarcinomas

The glycomic profiles of serous adenocarcinomas were also re-evaluated based on the site from which the tumour was surgically removed, that is ovary (left and right ovary; n = 14), omentum (n = 11) and peritoneum (n = 3) (Table S1). We observed a high number of tissue-based discriminatory glycans in which 13 N-glycans (0.001 < P < 0.05) and three O-glycans (P < 0.05) were identified, thereby discriminating between the three tissue origins (Table 1). Interestingly, two of the 13 N-glycan candidates that contained the LacdiNAc structure (m/z 1205.0^{2+} and m/z 1059.4^{2+}) were strongly associated with ovarian-derived cancer tissues, while the remaining two candidates (m/z 1294.0^{2+} and m/z 1148.4^{2+}) consisted of branched N-glycans and were found to be statistically elevated in the peritoneum-derived cancer tissues only (Fig. 5C). We further performed a linear discriminant analysis to visualize the discriminatory potential of these glycans (Fig. 5D). Interestingly, the ovarian-derived tissues were able to be separated based on the glycan candidates selected by the RF feature selection tool, while the peritoneum-derived tissue samples were found to be clustered separately from the omentum- and ovarian-derived tissues by the GLM feature selection tool (Fig. 5D), thereby indicating that serous cancers of ovarian and peritoneum origin, regardless of their diagnosis, can also be distinguished based on their respective tissue sites.

2.5. B4GALNT gene encoding glycosyltransferases are implicated in the distinction between OC and PC

Our glycan analysis on tissue samples revealed elevated levels of LacdiNAc-type N-glycans in both OC-diagnosed and ovarian tissue-derived serous adenocarcinoma samples. Glycan structures are often a consequence of altered gene expression of the corresponding glycosyltransferases responsible for their synthesis (Anugraham et al., 2014; Jacob et al., 2014b; Kawamura et al., 2008). We therefore accessed the transcriptomic Tothill data set to identify the expression of gene encoding glycosyltransferases potentially involved in the proposed biosynthetic pathway for the synthesis of LacdiNAc- and sialylated LacdiNAc-type structures (Fig. 6A). In the Tothill data set, 232 patients fulfilled the criteria for inclusion in our analysis and consisted of 199 clinically diagnosed OC and 33 PC patients. Upon performing the initial gene expression analysis, we hypothesized that both cancers may also be differentiated based on their glyco-gene expression profiles.

The comparison between the ovarian and peritoneal sites derived from the Tothill data set revealed five differentially expressed (P < 0.05) glycosyltransferase genes (Fig. 6B). Interestingly, two of the four possible β1-4-acetylgalactosamine transferase genes (B4GALNT1-4), B4GALNT3 and B4GALNT4, were found to be significantly elevated (P < 0.05) in the ovarian cancer tissues as compared to the peritoneum (Fig. 6B). We have previously reported that N-glycans with LacdiNAc motif were absent in human ovarian surface epithelial cells (HOSE6-3 and HOSE17-1), but...
Table 1. Statistical evaluation of N- and O-glycans implicated in the distinction of serous cancers based on their diagnosis and their tissue sampling site. The table depicts the statistically significant different glycan masses and corresponding glycan structures analysed by LC-MS/MS in tissue samples from OC and PC patients. The columns summarize statistical evaluation results (P-value, selected glycan by GLM and/or RF and corresponding diagnostic performance) for two comparisons, ‘diagnosis’ (OC vs. PC) and ‘tissue sampling site’ (ovary vs. peritoneum vs. omentum).

| Type    | Glycan mass | Structures | OC vs. PC (diagnosis) | Feature selection | Ovary vs. peritoneum vs. omentum (tissue sampling site) |
|---------|-------------|------------|-----------------------|-------------------|---------------------------------------------------------|
|         | [M-H]^-     | [M-2H]^2-  | Level of significance | Feature selection | Level of significance | Feature selection |
| N-Glycans | 2411.0      |            | 0.001                 | GLM RF            | 0.001                     | GLM RF            |
|         | 1875.6      |            | 0.001                 | GLM RF            | 0.01                      | GLM RF            |
|         | 2119.8      |            | 0.01                  | GLM RF            | 0.001                     | GLM RF            |
|         | 1713.6      |            | 0.05                  | GLM RF            | 0.05                      | GLM RF            |
|         | 1990.8      |            | 0.05                  | GLM RF            | 0.05                      | GLM RF            |
|         | 1479.6      |            | 0.05                  | GLM RF            | n.s.                      | n.s.              |
|         | 2078.8      |            | 0.05                  | GLM RF            | 0.05                      | GLM RF            |
|         | 2573.0      |            | 0.05                  | GLM RF            | 0.05                      | GLM RF            |
|         | 2160.8      |            | 0.05                  | GLM RF            | 0.05                      | GLM RF            |
| Type          | Glycan mass [M-H]^- | Glycan mass [M-2H]^- | Structures | OC vs. PC (diagnosis) | Feature selection | Ovary vs. peritoneum vs. omentum (tissue sampling site) |
|---------------|---------------------|----------------------|------------|----------------------|------------------|---------------------------------------------------------|
|              |                     |                      |            |                      |                  | Level of significance | Feature selection |
| Glycans       |                     |                      |            |                      |                  | P          | P (adj) | GLM | RF | AUC  | Sensitivity/specificity | P          | P (adj) | GLM | RF |
| 2589.0        | 1294.0              |                      |            |                      |                  | 0.001     | 0.0162 |    |    | 0.01 | 0.001| 0.0162 |                         |            |            |    |    |
| 2298.0        | 1148.5              |                      |            |                      |                  | 0.01      | 0.0283 |    |    | 0.01 | 0.0283 |                         |            |            |    |    |
| 1828.8        | 913.9               |                      |            |                      |                  | 0.05      | 0.1243 |    |    | 0.05 | 0.1243 |                         |            |            |    |    |
| 1891.6        | 945.3               |                      |            |                      |                  | 0.05      | 0.1880 |    |    | 0.05 | 0.1880 |                         |            |            |    |    |
| 2444.0        | 1221.5              |                      |            |                      |                  | 0.05      | 0.1292 |    |    | 0.05 | 0.1292 |                         |            |            |    |    |
| 2881.0        | 1440.0              |                      |            |                      |                  | 0.05      | 0.1786 |    |    | 0.05 | 0.1786 |                         |            |            |    |    |
| 3101.2        | 1550.1              |                      |            |                      |                  | 0.05      | 0.1219 |    |    | 0.05 | 0.1219 |                         |            |            |    |    |
| O-Glycans     | 749.3               |                      |            |                      |                  | 0.05      | 0.1219 |    |    | 0.05 | 0.1219 |                         |            |            |    |    |
| 755.3         |                     |                      |            |                      |                  | n.s.      | n.s.    |    |    | n.s. | n.s.    |                         |            |            |    |    |

Table 1. (Continued)

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Tissue glycomics distinguish serous tumour sites

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present in serous ovarian cancer cell lines (SKOV3 and IGROV1) (Anugraham et al., 2014). Hence, coupled with the new evidence from this study that the genes B4GALNT3 and B4GALNT4 are correlated with the presence of elevated LacdiNAc-type N-glycans on ovarian cancer tissue-derived cell membranes, we subsequently evaluated the glycan profiles of these serous ovarian cancer cell lines, together with an additional ovarian cancer cell line (EFO27) (Fig. 6C). In addition, a primary serous peritoneal cancer cell line derived from a PC patient was also incorporated to determine whether the presence of LacdiNAc is indeed restricted to OC. To date, there is no serous peritoneal cancer cell line commercially available (Jacob et al., 2014). Interestingly, both the N-glycans with sialylated LacdiNAc motifs (m/z 1205.02/C0 and m/z 1059.42/C0) found to differentiate OC tissues were present in the serous (SKOV3 and IGROV1) and mucinous (EFO27) ovarian cancer cell lines as depicted in the extracted ion chromatograms (EIC) (Fig. 6C), while no trace of these masses was observed in the primary serous peritoneal cancer cell culture (S129) (Fig. 6C). We next established RT-qPCR for B4GALNT3, B4GALNT4, ST6GAL2, ST3GAL4, ST3GAL5 and three reference genes to quantify gene expression in these cell lines (Table S4). In concordance with our observations in the Tothill data set comparing both tumour sites, the peritoneal cancer cell line S129 showed lowest expression of these genes, B4GALNT3 and B4GALNT4, compared to the nonovarian and ovarian cancer cell lines (n = 7), therefore reflecting the absence of LacdiNAc-type N-glycan structures in this primary PC cell line (S129).

As for the high expression of α2,6-sialylated glycans observed across both cancer types, we have previously shown that ST6GAL1, responsible for the synthesis of α2,6-linked N-glycans, was upregulated in all of the four cancer cell lines previously tested (Anugraham et al., 2014). The additional profiling of other sialyltransferase genes, ST6GAL2, ST3GAL4 and ST3GAL5, was found to display varying gene expression levels between both cancer tissue types (Fig. 6B) and across all tested ovarian cancer cell lines (Fig. 6D). The differences in their expression are potentially attributed to the regulation of these enzymes across several glycan classes, including glycolipids, which were not investigated in this study.

3. Discussion

The field of glycomics has become increasingly investigated for its potential to unravel tumour-specific glycans, which are associated with the cell surface of
Fig. 5. Statistical evaluation of MS-profiled N-glycan candidates involved in the discrimination of serous cancers based on diagnosis and tissue origin. (A) Box plot representing relative abundance of top two highest ranked N-glycan candidates that distinguish OC and PC based on diagnosis. Data points for each serous cancer group [serous ovarian cancer (n = 14), serous peritoneal cancer (n = 14)] represent total ion intensities of glycans in each category. (B) Receiver-operating characteristics curve for individual and feature selected glycans (refer to Table 1 for values of discriminants). (C) Box plot representing highest ranked glycan mass relative ion intensities in cancer tissues derived from omentum (OM), ovary (OV) and peritoneum (PE). Data points for each serous cancer group [ovarian (n = 14), omentum (n = 11), peritoneum (n = 3)] are represented. (D) Linear discriminant analysis of glycan masses selected by t statistics (Top 4, RF and GLM). Wilks lambda and corresponding P-value are provided in each scatter plot.
ovarian cancer cells (Drake et al., 2010). In the pursuit of discovering novel approaches to diagnosing the diverse group of high-grade pelvic serous cancers, N- and O-glycans were analysed from serous ovarian and peritoneal cancers using a glycomics-based MS profiling strategy, which has been successfully employed in recent glycan biomarker studies (Alley et al., 2012; Biskup et al., 2013; Kim et al., 2014). Specifically, released membrane protein glycans were subjected to a rigorous, structural MS-based characterization of glycans and classification-based statistical tools were used to assess the diagnostic performance of these glycans, in addition to subsequent validation of specific glycosyltransferase genes implicated in their expression. To the best of our knowledge, the structural analysis of membrane protein glycosylation profiles in these cancers represents the first study of its kind, with regard to the characterization of discriminatory N- and O-glycans of high-grade serous carcinomas. While N-glycosylation profiles of ovarian cancer plasma samples have been previously studied and characterized (Biskup et al., 2013; Mitra et al., 2013; Saldova et al., 2007, 2008), the membrane glycomic profiles of OC and PC tumour tissue samples have never been investigated and compared simultaneously. This study also showed the additional level of glycan profiling, namely via the identification of compositional and structural isomers, which is required for the determination of low abundance discriminatory structures in serous cancers of differing cellular origins.

The specific cellular glycosylation and phenotypic alterations that occur as a result of molecular genetic alterations play a crucial role in tumor development and progression. These alterations can provide insights into the mechanisms of cancer progression and offer potential targets for therapeutic intervention. The glycosylation profile of a tumor can be influenced by various factors, including genetic mutations, environmental factors, and the regional microenvironment. Understanding the glycosylation profile of ovarian and peritoneal cancers is essential for developing effective diagnostic and therapeutic strategies.

Fig. 6. LacdiNAc is expressed in ovarian cancer cells and absent in normal surface epithelium as well as primary peritoneal cancer cells. (A) Hypothetical synthesis pathway of LacdiNAc structures on N-glycoproteins. (B) Differentially expressed genes encoding glycosyltransferases involved in synthesis of LacdiNAc structures (B4GALNT3 and B4GALNT4) and expression of sialyltransferase genes (ST6GAL2, ST3GAL4 and ST3GAL5) using transcriptomic data obtained from ovarian-derived (OV) and peritoneum-derived (PE) cancer tissues (Tothill data set). Adjusted P-values are shown in each box plot. (C) Extraction ion chromatogram to show expression of LacdiNAc structures (m/z 1205.02 and m/z 1059.42) in normal epithelial cell lines (HOSE6-3, HOSE17-1), ovarian cancer cells [OVCAR3, SKOV3, IGROV1, A2780 and EFO27 (shift in retention time)] and primary peritoneal cells (S129). (D) Bar graph shows relative gene expression of relevant glyco-genes among the tested cell lines. Gene expression is displayed relative to the cell line with lowest expression.
mutations are unknown, particularly for these cancers. As opposed to ovarian cancers which have been extensively studied and characterized by high levels of genetic instability and frequent mutations of TP53 (Jarboe et al., 2008; Kurman and Shih Ie, 2011), primary serous peritoneal cancers are less frequently investigated (Jordan et al., 2008; Nik et al., 2014) and are thought to share a common aetiology with ovarian cancers based on their close histological and clinical similarities (Kessler et al., 2013). It is therefore not surprising that this close association between these serious cancers was also reflected in their membrane protein N- and O-glycomic profiles, as evidenced broadly by the similar abundance when grouped into their glycan types. It is also interesting to note that the membrane proteins of the tumour tissues displayed abundant sialylation, a feature that has also been observed in a recent study using high-resolution MALDI-MS imaging (Everest-Dass et al., 2016). In this study, the authors noted, however, that the mono- and disialylated glycans were predominantly located in the stromal region of ovarian tumour tissue cross-sections. Despite their similarities in overall glycan profiles, we demonstrate that the glycosylation of cell membrane proteins of cancer cells is specific to the disease and the location where the tumour sample was derived from. In particular, structurally related N-glycans containing LacdiNAc-type motifs, which have not been previously reported in membrane proteins of serious cancers, were found to be highly specific for OC. This nonreducing end terminal group is rare on mammalian glycoproteins, and can be further modified with sialic acid, fucose and sulfate (Hirano et al., 2014). In agreement with this finding, we have previously identified LacdiNAc-type N-glycans in ovarian cancer cell lines but not on normal HOSE cell line membrane proteins (Anugraham et al., 2014) and this glycan motif was also reported to be a tumour-specific glycan in breast and ovarian cancer cell lines investigated in a separate study (Guo and Abbott, 2015). In this tissue-based study, we identified three sialylated LacdiNAc-type N-glycans (m/z 1205.03, m/z 1059.42 and m/z 1079.92) that were capable of distinguishing OC from PC, and these glycans, together with an additional nonsialylated LacdiNAc-type N-glycan (m/z 913.92), were all found to be associated with ovarian cancer-derived tissues only. These findings point to the increasing evidence that glycans are indeed tissue specific and potentially offer a novel, yet exciting avenue for targeted therapies/diagnostics.

Most mammalian N-glycans contain LacNAc (Galβ1-3/GlcNAc) antennae, which form biantennary, or branched tri- and tetra-antennary structures that are usually capped by sialylation or extended to form poly-LacNAc chains. The less common LacdiNAc-type glycan, however, is synthesized by the action of specific β4-GalNAc transferases (e.g. B4GALNT3 or B4GALNT4) (Gotth et al., 2004; Sato et al., 2003). Interestingly, while no trace of LacdiNAc N-glycans was detected in the peritoneal cancer cell line, the non-serous, mucinous-type ovarian cancer cell line EFO27 was also found to display this motif, thereby indicating that LacdiNAc-type N-glycans could be largely associated with ovarian-derived cancer tissue. Nevertheless, further analyses on non-serous-type cell lines need to be performed to determine whether this epitope is non-serous specific. It is also interesting to note that these unique structures have never been reported in the sera of patients with ovarian cancer (Alley et al., 2012; Hua et al., 2013; Saldova et al., 2007), possibly due to the low abundance of these N-glycan epitopes. In regard to the glycosyltransferase expression extrapolated from the Toghill data set, there seems to be an increased expression of B4GALNT3 and B4GALNT4 in serious tumours derived from the ovary as compared to the peritoneum, consistent with our findings in this study. It is evident that a closer investigation into the specific regulation of the LacdiNAc-type pathway in high-grade serous cancers (HGSCs), particularly in cancers originating from the ovary, is warranted.

The peritoneal origin of serous cancers remains unclear as the normal peritoneum is composed of a layer of mesothelium that forms the lining of the abdominal cavity and can undergo malignant transformation to form a tumour entirely different from serous peritoneal carcinoma (Seidman et al., 2011). In fact, the serous-type epithelium from which serous peritoneal cancer is thought to be derived, positioned just underneath the peritoneal surface, is ciliated and considered identical to that of the normal fallopian tube. In regard to their glycan profiles, several glycosylation features were shown to be upregulated in PC and implicated in the distinction between ovary-, omentum- and peritoneum-derived tissues. Most notably, in peritoneal/omentum-derived serous cancer tissues, structures such as the bisecting GlcNAc-type (m/z 994.92), branched N-glycans with increased Gal-GlcNAc units (m/z 1294.02 and m/z 1148.42) and sialylated core 2 O-glycan (m/z 1331.52) were all found to be discriminatory. Bisecting GlcNAc N-glycan structures have been recently associated with survival in ovarian cancer and were found to result from an epigenetically regulated MGA73 expression (Kohler et al., 2016). Our findings may indicate that bisecting GlcNAc plays a role in ovarian cancer metastasis, possibly to various sites of the omentum/peritoneum. The
appearance of these glycan structures with greater complexity, that is branching patterns in the peritoneal/omentum-derived tissues, might be an adaptation of cancer cells at the metastatic site to maintain tumour growth, which has been demonstrated in the case of brain metastasis for patients with breast cancer (Bos et al., 2009).

In conclusion, our study provides the first molecular evidence that OC and PC represent two distinct diseases, reflected by differentially expressed glycans attached to glycoproteins and their corresponding altered glycosyltransferase gene levels. While at present there is increasing evidence that HGSCs originate from the fimbrial end of the tube, this is the first study performed to clearly demonstrate that OC and PC need to be regarded as distinct entities. It is possible that the two cancer types may have been derived originally from the fallopian tube and have metastasized and adapted different tissue glycosylation pathways, thereby displaying glycan features that are representative of their respective metastatic sites. Our preliminary analyses of omentum/peritoneal samples from an ovarian cancer case and ovarian-derived sample from peritoneal cancer case indicate that the glycan profiles exhibit similarity based on their site of origin, independent of the initial diagnosis. Ideally, knowledge of the glycomics profiles of cancer tissue samples derived from different locations including the metastasized sites will also provide mechanistic insights in future. Alternatively, it is possible that a specific subpopulation of serous tubal intraepithelial cancer cells, with a more mesenchymal-like differentiation, may trigger the omental or peritoneal invasion rather than the ovarian. The detection of these underlying morphological changes is challenging and may further complicate the clinical diagnosis of advanced-stage serous cancers, as well as the subsequent treatment and management of these aggressive cancers. It is therefore important that future clinical considerations incorporate the origin of each cancer type, and it is envisaged that the understanding of the differences in specific membrane glycosylation determinants between these serous cancers could provide alternative approaches for the disease to be diagnosed and ultimately facilitate the development of tailored ovarian cancer therapeutics.

4. Materials and methods

4.1. Biospecimens collection

Patients diagnosed with HGSCs were either admitted with an adnexal mass to the Department of Gynecology, University Hospital Zurich, Switzerland; Limmattalspital, Schlieren, Switzerland; the Gynecological Cancer Centre of the Royal Hospital for Women, Randwick, Australia; or the Gynecological Cancer Centre of the John Hunter Hospital in Newcastle, Australia. All patients were prospectively included after giving informed consent in accordance with ethical regulations (SPUK, Canton of Zurich, Switzerland, Hunter Area Research Ethics 04/04/07/3.04; South Eastern Sydney Illawarra HREC/AURED Ref: 08/09/17/3.02). Tissue and blood samples were collected during surgery. All samples were selected from chemo-naive tumours. Tissue was kept in RNA later solution (Life Technologies, Zug, Switzerland) and stored at −80 °C until further use. The processing of blood plasma samples was performed constantly on ice within three hours after collection as previously described (Jacob et al., 2011, 2012, 2014b). All clinico-pathological data were incorporated in a specifically designed in-house database (PEROV; Microsoft Access, Microsoft, USA). The diagnosis of these cancers as either serous ovarian (OC) or serous peritoneal (PC) cancers and their corresponding histopathological features were independently re-evaluated (Table S1).

4.2. Cancer tissue processing

Tissue processing was carried out using standardized clinical and ethical protocols approved through independent, board-approved institutions during the entire collection period (Macquarie University-Ref: 26/09/11/5201100778). All clinical and ethical protocols approved through independent, board-approved institutions during the entire collection period (Macquarie University-Ref: 26/09/11/5201100778). Tissue and blood samples were included after giving informed consent in accordance with ethical regulations (SPUK, Canton of Zurich, Switzerland, Hunter Area Research Ethics 04/04/07/3.04; South Eastern Sydney Illawarra HREC/AURED Ref: 08/09/17/3.02). Tissue and blood samples were collected during surgery. All samples were selected from chemonaive tumours. Tissue was kept in RNA later solution (Life Technologies, Zug, Switzerland) and stored at −80 °C until further use. The processing of blood plasma samples was performed constantly on ice within three hours after collection as previously described (Jacob et al., 2011, 2012, 2014b). All clinico-pathological data were incorporated in a specifically designed in-house database (PEROV; Microsoft Access, Microsoft, USA). The diagnosis of these cancers as either serous ovarian (OC) or serous peritoneal (PC) cancers and their corresponding histopathological features were independently re-evaluated (Table S1).

4.3. Membrane protein extraction and glycan release from membrane proteins

Tissues were washed in PBS prior to the Triton X-114-based membrane protein extraction protocol carried out as previously described (Lee et al., 2009). Briefly, cut tissues were homogenized in lysis buffer and the lysed cells in the supernatant were further sedimented by ultracentrifugation. The membrane cell pellet was
were integrated using COMPASS DATA ANALYSIS version
negative ionization mode as \([\text{M-H}]^{-}\), and the capillary voltage was set at 3 kV with helium as the collision gas. The sample injection volume was 7 and 4 

- glycans were collected and treated with sodium borohydride. For \(O\)-glycans, the remaining PVDF spots were treated with sodium borohydride and released via reductive \(\beta\)-elimination. \(N\)- and \(O\)-Glycan alditols were desalted using cation-exchange resin beads (AG50W-X8) and residual borate was removed by adding methanol. The purified \(N\)- and \(O\)-glycan alditols were resuspended in milliQ water prior to mass spectrometry analysis.

4.4. Mass spectrometric analysis of \(N\)- and \(O\)-glycans

The separation of glycans was performed on a Hypercarb porous graphitized carbon capillary column (5 \(\mu\m) Hypercarb KAPPA, 180 \(\mu\m \times 100 \) mm; Thermo Hypersil, Runcorn, UK) over a linear gradient for 85 min of 0–45\% and 45 min of 0–90\% (v/v) acetonitrile/10 mM ammonium bicarbonate for \(N\)- and \(O\)-glycans, respectively. The MS instrument used in this study consisted of an ion trap mass spectrometer (LC/MSD Trap XCT Plus Series 1100; Agilent Technologies, Santa Clara, CA, USA) connected to an ESI source (Agilent 6330) and an Agilent autosampler (Agilent 1100). The temperature of the transfer capillary was maintained at 300 °C and the capillary voltage was set at 3 kV with helium as the collision gas. The sample injection volume was 7 and 4 \(\mu\L\) for \(N\)- and \(O\)-glycans, respectively, and the flow rate was set at 2 \(\mu\L\) min\(^{-1}\). \(N\)- and \(O\)-Glycan alditols were detected in negative ionization mode as \([\text{M-H}]^{-}\) and \([\text{M-2H}]^{-}\) ions within the mass range of \(m/z\) 200–2200. MS data were integrated using COMPASS DATA ANALYSIS version 4.0 software (Bruker Daltonics, Billerica, MA, USA). Monoisotopic masses detected in negative mode were assigned to possible monosaccharide compositions using the GlycoMod tool (Cooper et al., 2001) available on the ExPASy server (http://au.expasy.org/tools/glycomod) with a mass tolerance of ± 0.5 Da. Glycan structures were identified based on manual annotation of tandem MS fragmentation spectra and further characterized with the aid of software-generated mass fragments using GlycoWorkBench (Ceroni et al., 2008). Verification of the proposed structures was also carried out using UniCarb DB (Campbell et al., 2014b; Hayes et al., 2011), a web-based LC-MS/MS database containing fragmentation and retention times of previously reported \(N\)- and \(O\)-glycans (Campbell et al., 2014a).

4.5. Cell culture

Ovarian cancer cell lines (IGROV1, A2780, SKOV3, EFO27 and OVCAR3) and human ovarian surface epithelial cells (HOSE6-3 and HOSE17-1) were grown in RPMI-1640 media (Sigma-Aldrich, Buchs, Switzerland) supplemented with 10\% (v/v) fetal bovine serum (FBS; Sigma-Aldrich), penicillin (100 U mL\(^{-1}\)) and streptomycin (100 \(\mu\g\) mL\(^{-1}\) (Sigma-Aldrich). They were incubated at 37 °C in a 95\% humidified atmosphere containing 5\% CO\(_2\). Cells were propagated at about 80\% confluence every two to three days and tested routinely for mycoplasma infection (Uphoff and Drexler, 2005). Cultured cells were harvested using Cell Dissociation Solution nonenzymatic 1× (Sigma). In regard to culture of primary serous peritoneal cancer cells, ascites was collected at the time of surgery, centrifuged at 3000 g for 10 min and cultured in DMEM/F12 (FBS, Sigma-Aldrich) supplemented with 20\% (v/v) fetal bovine serum, penicillin (100 \(U\) mL\(^{-1}\)) and streptomycin (100 \(\mu\g\) mL\(^{-1}\)).

4.6. Reverse transcription quantitative polymerase chain reaction (RT-qPCR)

In order to examine the expression of ‘glyco’ and reference genes, cells were grown in six-well plates (NUNC, Thermo Fisher Scientific, Roskilde, Denmark). Cells were washed twice using DPBS (Gibco, Sigma-Aldrich, Basel, Switzerland) and lysed, and total RNA was isolated using NucleoSpin RNAII kit (MACHEREY-NAGEL, Macherey-Nagel AG, Oensingen, Switzerland). RNA was eluted in 50 \(\mu\L\) 
RNase-free water. After extraction and concentration, total RNA was measured at \(A_{260/230}\) nm and \(A_{260/280}\) nm using NanoDrop ND-1000 spectrophotometer (Thermo Fisher Scientific). The RNA integrity of samples was confirmed by electropherograms (Agilent 2100 Bioanalyzer, Agilent Technologies (Schweiz) AG Life Sciences & Chemical Analysis, Basel, Switzerland). An amount of 1 \(\mu\g\) of total RNA was reverse-transcribed using the iScript Reverse Transcription
Supermix for RT-qPCR (Bio-Rad Laboratories AG, Cressier, Switzerland) and complementary DNA (cDNA) was stored at −20 °C until use. RT-qPCR was performed in concordance to MIQE guidelines (Bustin et al., 2009; Jacob et al., 2014b). qPCR was performed on ‘glyco’ genes (B4GALNT3, B4GALNT4, ST3GAL4, ST3GAL5 and ST6GAL2) and three putative reference genes (SDHA, YWHAZ and HSPCB) (Tables S3 and S4). Primers specific to ‘glyco’ genes were designed using QuantPrime (Arvidsson et al., 2008). qPCR was performed on Applied Biosystems Real-Time PCR System (Life Technologies) in 384-well microtitre plates (Life Technologies). To achieve reliable gene expression patterns, all ‘glyco’ gene expressions were normalized against the logarithmic mean of the three reference genes.

4.7. Data acquisition and bioinformatical analysis

For the exploratory genetic analyses, we used a publicly available Affymetrix microarray data set involving patients with OC and PC that provided associated clinical information. As most data sets did not pass the selection criteria of including both OC and PC, the Tothill analysis was selected as it was the only one that fulfilled these criteria (Tothill et al., 2008). CEL files (Affymetrix U133, n = 285) and clinical data were downloaded from the Gene Expression Omnibus (GSE9899). The tumour location for sampling was provided in the supplementary data of the original publication (Tothill et al., 2008) and this information was incorporated into our study. We included only high-grade serous ovarian or peritoneal cancers of advanced FIGO stages into our analysis to provide a homogeneous group. Statistical analysis and figures were obtained through the use of the software R version 3.1.3 (www.R-project.org). Following R packages were therefore applied: ‘cgdsr’, ‘catspec’, ‘compareGroups’, ‘party’, ‘ggplot2’ and ‘Repp’. The ‘limma’ package from bioconductor open source software for bioinformatics (R statistical software) was used to identify differentially expressed genes between study groups. P-values were adjusted by the Benjamin–Hochberg false discovery rate method. In order to perform stable feature selections for classification and prediction of subgroups, two popular methods were selected, random forest (RF) and penalized generalized linear model (GLM). RF was performed using the package ‘randomForestSRC’. Penalized multinomial regression (Glmnet) was performed using the package ‘glmnet’ within the R software. The comparison of two algorithm guarantees a certain stability of the selected features. Subsequent ROC curves with corresponding AUC were estimated using the R package ‘pROC’. Additional linear discriminant analysis (LDA) and multivariate ANOVA were performed to test and visualize the performance of the feature selections (R package ‘lda’, ‘manova’). Survival analysis was conducted using Kaplan–Meier curves with corresponding log-rank tests (R package ‘Survival’). A P-value < 0.05 was considered significant but interpreted exploratory. All evaluations were made using R version 3.1.3 and bioconductor.

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Author contributions

VHS, FJ, MA and NHP designed research; MA and FJ performed experiments; VHS, NHP, NVB, DF, AF, NFH and MMH contributed and prepared samples, reagents and analytic tools; FJ, MA, AVED and AS analysed data; MA, FJ, NHP, NFH and VHS wrote the manuscript.

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Supporting information

Additional Supporting Information may be found online in the supporting information tab for this article:

Fig. S1. Relative quantitation of abundances of sialylation levels (mono-, di- and tri-) and branching patterns of N- and O-glycans.

Fig. S2. Representative MS² fragment ion spectra depicting the diagnostic ions of bisecting GlcNAc type N-glycans in serous cancers.

Fig. S3. Representative extracted ion chromatograms (EIC) of glycan masses bearing terminal LacdiNAc (GalNAc-GlcNAc) at m/z 913.92 and sialylated
LacdiNAc (Neu5Ac-GalNAc-GlcNAc) at $m/z$ 1205.02$^-$
serous ovarian and peritoneal cancers.

**Table S1.** Source and clinico-pathological information
of serous cancer specimens.

**Table S2.** Proposed $N$- and $O$-glycan structures
detected on the membrane proteins of serous cancers
derived from the ovary and peritoneum.

**Table S3.** QPCR parameters providing the standard
curve parameters for each primer pair on 8 targeted
genes.

**Table S4.** QPCR parameters providing the standard
curve parameters for each primer pair on 8 targeted
genes.