Research Article

Combined Phosphoproteomics and Bioinformatics Strategy in Deciphering Drug Resistant Related Pathways in Triple Negative Breast Cancer

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Because of the absence of a clear therapeutic target for triple negative breast cancer (TNBC), conventional chemotherapy is the only available systemic treatment option for these patients. Despite chemotherapy treatment, TNBC patients still have worse prognosis when compared with other breast cancer patients. The study is to investigate unique phosphorylated proteins expressed in chemoresistant TNBC cell lines. In the current study, twelve TNBC cell lines were subjected to drug sensitivity assays against chemotherapy drugs docetaxel, doxorubicin, gemcitabine, and cisplatin. Based on their half maximal inhibitory concentrations, four resistant and two sensitive cell lines were selected for further analysis. The phosphopeptides from these cells were enriched with TiO₂ beads and fractionated using strong cation exchange. 1,645 phosphoprotein groups and 9,585 unique phosphopeptides were identified by a high throughput LC-MS/MS system LTQ-Orbitrap. The phosphopeptides were further filtered with Ascore system and 1,340 phosphoprotein groups, 2,760 unique phosphopeptides, and 4,549 unique phosphosites were identified. Our study suggested that differentially phosphorylated Cdk5, PML, AP-1, and HSF-1 might work together to promote vimentin induced epithelial to mesenchymal transition (EMT) in the drug resistant cells. EGFR and HGF were also shown to be involved in this process.

1. Introduction

Breast cancer is the most common cancer in women [1]. Although the overall incidence of breast cancer is rising worldwide, the mortality rate has been decreasing in the United States [2]. The improved survival rate is likely to be a result of the success in early detection and better treatment in patients with positive estrogen receptors (ER), progesterone receptors (PR), or human epidermal growth factor receptor 2 (Her2/neu) breast cancers [3]. Triple negative breast cancers (TNBC) by default have been grouped together because of the lack of ER, PR, and Her2/neu markers [4, 5]. Compared to the other subtypes of breast cancer, these tumors are frequently more aggressive, manifested by a higher distant relapse rate with more frequent visceral as well as central nervous system metastases and higher mortality rate despite chemotherapy [6–8]. The heterogeneous biology and histopathology of TNBC underlie the unpredictable responses to chemotherapy and diverse clinical outcomes seen in these patients. The majority of TNBC with relapse is multidrug resistant and ultimately becomes refractory to all therapies [9, 10]. To improve treatment, it is important to develop novel therapeutic strategies to predict and overcome drug resistance.

In the last two decades, proteomics has emerged as a powerful tool in biomarker discovery and mechanism understanding. Using these tools, researchers can efficiently perform large-scale screening to attain valuable information. Proteomics has been used as a tool to identify new disease related biomarkers in TNBC [11, 12]. Protein phosphorylation, one of the most ubiquitous posttranslational modifications (PTMs), is a key event in regulating many vital functions in cells including proliferation, survival, apoptosis, and signal
transduction [13–15]. Protein phosphorylation, involved in signal transduction of the cells, requires a coherent activation of protein kinases and phosphatases, which leads to the defined functions [16]. The basal level of the phosphoproteins may also represent the characters of the cells. For example, Stearns et al. [17] reported that the stable tyrosine phosphorylation of the IL-10 receptor may increase TIMP-1 levels to block tumor cell invasion modified by Boyden chamber invasion assays. Börner et al. [18] reported that the stable phosphorylation of the inhibitory Tyr-505 of the leukocyte-specific protein tyrosine kinase (Lck) may arrest Lck in its inhibited form. In recent years, the advances in phosphoproteomics research have allowed discovery of many important functions operating in cancer progression. Oyama et al. performed quantitative phosphoproteome and transcriptome analysis on ligand-stimulated MCF-7 breast cancer cells to study the mechanism of tamoxifen resistance [19]. They found that GSK3β and AP-1 transcription factors might be involved in the tamoxifen resistance in MCF-7 cells [19]. Rexer et al. used a phosphoproteomic approach to study lapatinib-resistance of HER2-overexpressing human breast cancer cell lines and found that the increased Src kinase activity was a mechanism of lapatinib resistance [20]. Olveras-Ferraro et al. also reported a study on TNBC cell lines using low throughput phosphoproteomic approaches [21]. However, there has been no study focusing on dissecting TNBC drug resistance using large-scale phosphoproteomic tools. In this study, we used high throughput technologies to study changes in phosphorylated proteins to uncover important pathways involved in TNBC drug resistance.

For the purpose of this study, TNBC cell lines responding to multiple chemotherapeutic drugs were studied and were compared. Twelve established TNBC cell lines were tested against four chemodrugs and the half maximal inhibitory concentrations (IC50s) were calculated. The phosphorylated peptides of four resistant and two sensitive cell lines were analyzed using LC-MS/MS to discover important pathways related to chemodrug resistance of TNBC. Our study may lead to identification of useful prognostic biomarkers and therapeutic pathways for TNBC treatment.

2. Materials and Methods

2.1. Human Breast Cancer Cell Lines and Cell Culture. Triple negative breast cancer cell lines MDA-MB-231, MDA-MB-468, MDA-MB-436, HCC1887, HCC1806, and HCC1937 (all of which stain negative for ER, PR, and lack Her2/neu amplification) were obtained from American Tissue Type Culture Collection (ATCC, Manassas, VA, USA) [22, 23]. Cells were maintained in Dulbecco’s minimal essential medium (Invitrogen, Carlsbad, CA, USA) or RPMI 1640 (Invitrogen) with 10% heat-inactivated Fetal Bovine Serum (Thermo Fisher Scientific, San Jose, CA, USA), 100 units/mL penicillin, and 100 μg/mL streptomycin, at 37°C in 5% CO₂.

2.2. In Vitro Drug Sensitivity Assay. Cell lines were treated with docetaxel, doxorubicin, gemcitabine, and cisplatin in vitro to determine the half maximal inhibitory concentration (IC50) of each drug. The cells were treated with DMSO or twenty predetermined doses of each drug for two days. Cell viabilities were determined by CellTiter-Glo Luminescent Cell Viability Assay (Promega, Madison, WI, USA). Triplicated experiments were performed twice and the IC50s were calculated using GraphPad Prism 5 software.

2.3. Sample Preparation. Cultured cells were lysed in lysis buffer (8 M urea, 4% CHAPS, 40 mM Tris-base, 65 mM DTT, 1% SDS) and the supernatant was collected into 1.5 mL tubes. Protein concentration of the lysate was determined using the Pierce BCA protein assay (Thermo Fisher Scientific). 20 μL of 1 M DTT (Thermo Fisher Scientific) was added to samples containing 1 mg of proteins and incubated at 56°C for 1 hour and followed by an incubation at room temperature for 40 min in darkness with 80 μL of 1 M IAA added into the buffer. Each sample was treated with 0.11 volumes of ice-cold 100% trichloroacetic acid (TCA) (Sigma Aldrich, St. Louis, MO, USA) on ice for 10 min and 500 μL of ice-cold 10% TCA on ice for 20 min and then was spun down at 20,000 × g for 30 min. The pellet was washed with 500 μL of acetone and was centrifuged again at 20,000 × g for 10 min. The protein pellets of all samples were collected and dried in a vacuum evaporator. 500 μL of 100 mM ammonium bicarbonate (Sigma Aldrich) and 20 μg of trypsin (Promega, San Luis Obispo, CA, USA) were added to the sample in each tube at 37°C for 2 hours. An additional 20 μg of trypsin was added to the sample and subsequently incubated for 16 hours. The peptides were then filtered through 10 kDa filter columns (EMD Millipore, Billerica, MA, USA) and dried via vacuum evaporator.

2.4. Phosphopeptide Enrichment. 400 μL of loading buffer (80% acetonitrile (ACN) and 2% trifluoroacetic acid (TFA)) was added to 1 mg of peptides. The mixture was incubated with 4 mg of TiO₂ beads (GL Sciences, Torrance, CA, USA) for 1 hour. The samples were centrifuged at 3,000 × g for 5 min and the supernatant was discarded. TiO₂ beads were collected and washed with 1 mL wash buffer I (30% ACN, 2% TFA) followed by 1 mL of wash buffer II (80% ACN, 0.1% TFA), each for 20 min at 4°C with rotation and centrifuged at 3,000 × g for 5 min. The phosphopeptides were eluted first with 400 μL elution buffer I (400 mM NH₄OH, 50% ACN, pH 11) and was followed by 400 μL elution buffer II (500 mM NH₄OH, 60% ACN, pH 11). Nest Group MicroSpin strong cation exchange solid phase extraction tubes (The Nest Group Inc., Southborough, MA, USA) were used as a separation technique before mass spectrometry to reduce the complexity of samples and enhance the identification rate.

2.5. LC-MS/MS Analysis of Peptides. All peptide fractions were desalted before analysis using C18 tips made from the Empore C18 90 mm Disk (3 M Corporate, St. Paul, MN, USA). Nanoliquid chromatography and tandem mass spectrometry (nLC-MS/MS) with Collision Induced Dissociation (CID) was performed on a LTQ-Orbitrap (Thermo Fisher Scientific) integrated with an Eksigent nano-LC (Eksigent Technologies, Monmouth Junction, NJ, USA). The flow rate
for reverse-phase chromatography was 500 nL/min for the loading and analytical separation (Buffer A: 0.1% formic acid, 3% ACN; Buffer B: 0.1% formic acid, 100% ACN). Peptides were resolved by the gradient of 3–40% buffer B over 180 min. The Orbitrap was operated in data-dependent mode with a mass resolving power of 30,000 at m/z 400.

The spectral count data of the phosphopeptides were analyzed using online database String which is a database of known and predicted protein interactions including direct (physical) and indirect (functional) associations [25]. Hierarchical clustering analysis was performed using Euclidean distance formulation and complete linkage criteria for linkage of normalized phosphopeptide spectrum counts. Based on the comparison (1), only the peptide spectrum counts with P values less than 0.05 were imported to Permutmatrix software [26].

### 2.6. Database Searching and Analysis

Mass spectra were searched against the Uniprot Human database using Proteome Discoverer software (Version 1.4, Thermo Fisher Scientific), utilizing the Sequest (Thermo Fisher Scientific), Mascot (Matrix Science, London, UK), and X!Tandem (http://www.thegpm.org/tandem/) algorithms, while running a target decoy search strategy to increase protein identity confidence. Mascot and Sequest were searched with a fragment ion mass tolerance of 0.02 Da and a parent ion tolerance of 10.0 PPM and tolerated up to two missed trypsin cleavages. Carbamidomethylation of Cysteine was specified as a fixed modification. Glu or Gln to pyro-Glu of the n-terminus, oxidation of methionine, and phosphorylation of serine, threonine, and tyrosine were specified as variable modifications.

The Proteome Discoverer search results were loaded to Scaffold (Version 4.1.1, Proteome Software Inc., Portland, OR, USA) to quantify and validate the MS/MS peptide and protein identifications. Identifications were accepted if they had a greater than 95% peptide probability and contained at least one identifiable phosphopeptide. Scaffold PTM (Version 2.1.3, Proteome Software Inc.) was used to annotate phosphosites located in MS/MS spectra. Phosphosite localization probabilities were calculated using the Ascore probability based scoring technique [24] and only sites that met the stringent minimum of 99% were accepted.

The spectral count data of the phosphopeptides were acquired through Scaffold PTM and were compared between grouped cell lines: (1) all four resistant cell lines were compared with the two sensitive cell lines HCCI806 and MDA-MB-468; (2) resistant cell lines MDA231 and MDA-MB-436 were compared to the two sensitive cell lines; (3) resistant cell lines HCCI187 and HCCI1937 were compared to the two sensitive cell lines.

### 3. Results

#### 3.1. Chemotherapy Drug Sensitivity Assay and Cell Line Selection

Protein phosphorylation is an important posttranslational modification that governs many of the signaling changes in cancer cells. The current study was performed to screen the signaling pathway changes, through the comparison of phosphorylated proteins in TNBC cell lines with extreme responses to the four chemotherapy drugs. The half maximal inhibitory concentrations (IC50s) of twelve TNBC cell lines against four chemotherapy drugs were determined and four resistant and two sensitive cell lines were selected for further analysis. Cell lines were ranked according to their IC50s against each drug (Table 1). No response is defined as the inability to reach a 50% of inhibition when the highest dose of chemotherapeutic drug was administered. Coefficient of Determination $R^2$ values of the drug sensitivity curves (data not shown) less than 0.7 were also considered as no response. HCCI187, MDA-MB-436, MDA-MB-231, and HCCI1937 had the highest IC50s for at least three of the four drugs and were thus considered chemotherapy-resistant. HCCI806 and MDA-MB-468 were ranked lowest on the IC50 scale for at least three of the four drugs and were considered

### Table 1: The IC50 ranking of twelve TNBC cell lines against four chemotherapy drugs.

| IC50 ranking | Doxorubicin IC50 (nM) | Docetaxel IC50 (nM) | Gemcitabine IC50 (nM) | Cisplatin IC50 (nM) |
|--------------|-----------------------|----------------------|-----------------------|---------------------|
| 1            | HCCI1395 (5783)       | HCCI187 no response  | HCCI187 no response  | HCCI187 no response |
| 2            | MDA157 (1322)         | MDA436 no response   | MDA436 no response   | MDA436 no response  |
| 3            | HCCI1937 (841.7)      | HS578T no response   | MDA231 no response   | MDA231 no response  |
| 4            | MDA436 (840.1)        | HCC38 (318634)       | HCCI1395 no response | HCCI1395 no response|
| 5            | MDA231 (644.6)        | HCCI1937 (253392)    | MDA157 no response   | MDA157 no response  |
| 6            | HCC70 (531.4)         | HCC70 (253375)       | HS578T no response   | HCCI1937 (333854)   |
| 7            | HS578T (454)          | MDA231 (215645)      | HCCI1937 no response | HCC38 (232374)      |
| 8            | HCCI187 (413.9)       | HCCI1395 (197207)    | HCC70 no response    | HCCI1806 (208994)   |
| 9            | BT20 (401.5)          | MDA157 (160190)      | BT20 (510.4)         | BT20 (186719)       |
| 10           | HCCI806 (233.2)       | BT20 (149325)        | MDA468 (146)         | MDA468 (59710)      |
| 11           | MDA468 (158.9)        | MDA468 (2.378)       | HCC38 (11.03)        | HS578T (46238)      |
| 12           | HCC38 (131.2)         | HCCI806 (1.102)      | HCCI806 (4.163)      | HCC70 (30469)       |
chemotherapy-sensitive. These six cell lines were selected for phosphorylated protein analysis.

3.2. Phosphopeptides Identification and Overall Results Profiling. To increase the accuracy of identification, the spectra were cross-validated using three searching algorithms (Sequest, Mascot, and X!Tandem) against the Uniprot-Human database with the application of a decoy database. Proteome Discoverer was used in tandem with Scaffold and Scaffold PTM for quantification. A total of 1,645 phosphoryprotein groups were identified by scaffold software across all six TNBC cell lines, using peptide probability thresholds of 95% with a minimum of one unique peptide (Figure 1(a)). The peptide False Discovery Rates (FDR) is 1.2% (Decoy) and protein FDR is 19.6%. All the decoy peptides and proteins were excluded. Accordingly, a total of 9,585 unique phosphopeptides with 10,091 unique phosphosites were identified (see Supplementary Table 1 in Supplementary Material available online at http://dx.doi.org/10.1155/2014/390781). Instances where the same peptide sequence had different phosphosites were counted as one peptide and ultimately 3,062 peptide sequences were identified (Figure 1(b)). The overall class profiles of the phosphoproteins specifically for resistant and sensitive cell lines were also expressed according to their gene ontology (GO) annotation. When compared to each other, more phosphoproteins involved in cellular adhesion processes were found in resistant cell lines while in sensitive cell lines more phosphoproteins were associated with multiorganism processes, cell killing, pigmentation, and rhythmic processes (Figures 1(c) and 1(d)). When the cellular compartments of these proteins were studied, the resistant cell lines showed more phosphoproteins in extracellular regions, mitochondrion, and plasma membrane whereas in sensitive cell lines more phosphoproteins were found in Golgi apparatus and cytoskeleton (Figures 1(e) and 1(f)). Figure 2 shows the representative MS/MS spectra for three phosphopeptides marked with phosphosites. These phosphopeptides differed dramatically between drug resistant and sensitive cell lines and will be discussed below. The high quality spectra maps were very helpful in identifying peptides as well as phosphosites on them.

3.3. Phosphosites Confirmation and Label Free Quantification. In the current study, Scaffold PTM was used to further confirm the phosphosites identified and to construct a final quantification report. Scaffold PTM uses the Ascore algorithm to verify the presence of the phosphorylation sites. With the condition of a 99% Ascore certainty and 99% minimum localization probability threshold, a total of 1,340 phosphoprotein groups, 2,760 unique phosphopeptides, and 4,549 unique phosphosites were identified across all 6 cell lines (Supplementary Table 2). The mass spectra quantification data of these phosphopeptides were exported and further analyzed to determine the variations between chemotherapy-resistant and chemotherapy-sensitive cell lines (Supplementary Table 2). The spectrum counts of phosphorylated peptides were evaluated by computing the P value and fold change between the two groups of cell lines. Only phosphopeptides with a P value less than 0.05 and a fold change above 2 or less than 0.5 were considered. From three sets of comparisons (see in Section 2), three sets of numbers were obtained (shown in Supplementary Table 3. Sheets 1, 2, and 3). All significantly changed phosphopeptides were further analyzed using the online String database for predicted protein interactions (see below)

3.4. Differential Phosphopeptides and Phosphoproteins Analysis. Four drug resistant cell lines and two drug sensitive cell lines selected by IC50 ranking were subjected to phosphoproteome analysis in the current study. To confirm that these cell lines can be separated by the differentially expressed phosphopeptides into two groups: chemotherapy-resistant and chemotherapy-sensitive TNBC, the clustering analysis was performed. Figure 3 shows that the four drug-resistant cell lines shared much more similarity with each other than the two sensitive cell lines and they could be clearly segregated from the two sensitive cell lines. This result further supported the IC50 data and suggested that the phosphopeptide identification and quantification methods are valuable in characterizing drug sensitivity of TNBC. The changed phosphopeptides described above were then analyzed with String database. All the changed phosphopeptides from Supplementary Table 3 were analyzed. The corresponding genes of these phosphopeptides were loaded to String to construct a network showing the associations between them. The genes with most connections in the network were shown in Figure 4 and Table 2. As shown in Figure 4, the changed phosphoproteins have strong associations and intricate interactions with one another. The pathways associated with the most prominent changes in drug-resistant TNBC are schematically summarized in Figure 5. These proteins and their roles in cancer drug resistance will be discussed.

4. Discussion

Over the last few decades there has been a steady decrease in breast cancer mortality rate largely due to the improvements in the treatment of breast cancer [27]. Despite the significant advancement made in breast cancer therapy in recent years, much of this progress is limited to hormone receptor positive and Her2/neu positive breast cancers. Specific targeted agents are still lacking for TNBC tumors leaving cytotoxic chemotherapy as the only therapeutic choice. Though cytotoxic chemotherapy is effective for many of these patients, the absence of a therapeutically targetable molecule or pathway limits the progress in treating these patients, which is manifested by rapid relapse and death when the tumors are resistant to the conventional chemotherapy. The identification of novel biomarkers indicative of drug sensitivity is imperative for the effective treatment of this exceptionally aggressive type of breast cancer. In our previous study we utilized a hydrophobic fractionation protocol in an effort to detect novel membrane proteins in triple negative breast cancer [28]. Although the identification of membrane biomarker is valuable, the heterogeneity of TNBC tumors commands
Figure 1: Phosphoproteins and phosphopeptides identified in TNBC. (a) Venn diagram of the total unique phosphoproteins identified in the two groups of cell lines (chemotherapy-resistant and chemotherapy-sensitive). 287 unique phosphoproteins were found only in resistant cell lines (TNBC-R) and 66 phosphoproteins were found only in sensitive cell lines (TNBC-S). (b) Venn diagram of the total unique phosphopeptides identified in the two groups of cell lines. 1171 unique phosphopeptides were found only in resistant cell lines and 502 phosphopeptides were found only in sensitive cell lines. Peptides with the same sequence, but different phosphorylated sites, were counted as one peptide in this diagram. (c) Pie graph illustrates the biological process of phosphoproteins only identified in resistant TNBC cell lines. (d) Pie graph illustrates the biological process of phosphoproteins only identified in sensitive TNBC cell lines. (e) Pie graph illustrates the cellular compartments of phosphoproteins only identified in resistant TNBC cell lines. (f) Pie graph illustrates the cellular compartments of phosphoproteins only identified in sensitive TNBC cell lines.
Table 2: Selected phosphopeptide list with quantification data.

| Protein name                                      | Peptide                        | Gene      | Site   | 231, 436, 1187, 1937 versus 1806 & 468 P value | Fold change | 231 & 436 versus 1806 & 468 P value | Fold change | 1187 & 1937 versus 1806 & 468 P value | Fold change |
|-------------------------------------------------|--------------------------------|-----------|--------|-----------------------------------------------|-------------|--------------------------------------|-------------|--------------------------------------|-------------|
| Serine/arginine repetitive matrix protein 1      | KEKPELPESPVK                   | SRRM1     | T220   | 0.001                                         | 0.39        | 0.023                                | 0.35        | 0.049                                | 0.42        |
| Serine/arginine repetitive matrix protein 1      | RYSPPQPQR                      | SRRM1     | S606   | 0.000                                         | 0.34        | 0.022                                | 0.46        | 0.002                                | 0.22        |
| Serine/arginine repetitive matrix protein 1      | RRSPSPPTR                      | SRRM1     | S558   | 0.038                                         | Sensitive only | 0.038                                | Sensitive only | 0.002                                | 0.22        |
| Serine/arginine repetitive matrix protein 1      | RRSPSPPTR                      | SRRM1     | S560   | 0.038                                         | Sensitive only | 0.038                                | Sensitive only | 0.002                                | 0.22        |
| Catenin delta-1                                  | VGGSvVDLHR                     | CTNN1D1   | S269   | 0.005                                         | Sensitive only | 0.038                                | Sensitive only | 0.002                                | Sensitive only |
| Catenin delta-1                                  | GSLASfDSLRL                     | CTNN1D1   | S349   | 0.008                                         | 0.31        | 0.013                                | 0.08        | 0.002                                | Sensitive only |
| Catenin delta-1                                  | GSLASfDSLRL                     | CTNN1D1   | S346   | 0.035                                         | 0.25        | 0.038                                | 0.25        | 0.038                                | 0.25        |
| Catenin delta-1                                  | sGDLDGMEPLK                     | CTNN1D1   | S920   | 0.035                                         | 0.25        | 0.038                                | 0.25        | 0.038                                | 0.25        |
| Catenin delta-1                                  | HYEDGYPGGSNDNYGSLR              | CTNN1D1   | S230   | 0.038                                         | Sensitive only | 0.038                                | Sensitive only | 0.002                                | Sensitive only |
| Sororin                                          | IVAHAVEVPAVQsPR                  | CDCA5     | S75    | 0.012                                         | Sensitive only | 0.005                                | 0.11        | 0.002                                | 0.22        |
| Eukaryotic translation initiation factor 4 gamma 2 | FsPTMGR                        | EIF4G2    | S395   | 0.011                                         | 0.39        | 0.005                                | 3.50        | 0.005                                | 11.67       |
| Methyl-CpG-binding domain protein 1              | VTNDsSPESPGVGR                   | PCM1      | S65    | 0.038                                         | 2.75        | 0.002                                | 3.50        | 0.002                                | Sensitive only |
| Eukaryotic translation initiation factor 4 gamma 1 | ANKIPLRPLDPTR                   | EIF4GI    | T607   | 0.007                                         | 0.10        | 0.021                                | Sensitive only | 0.002                                | Sensitive only |
| Eukaryotic translation initiation factor 4 gamma 1 | ANKIPLRPLDPTR                   | EIF4GI    | S148   | 0.002                                         | 3.50        | 0.002                                | 3.50        | 0.002                                | Sensitive only |
| Eukaryotic translation initiation factor 4 gamma 3 | RsPVPAQAIITVPK                  | EIF4G3    | S99    | 0.043                                         | 3.75        | 0.033                                | 4.0         | 0.015                                | 3.50        |
| Nuclear pore complex protein Nup153              | sPGFASPK                        | NUP153    | S645   | 0.005                                         | Sensitive only | 0.038                                | Sensitive only | 0.038                                | Sensitive only |
| Alpha-2-HS-glycoprotein                          | cDSSPDsAEVRK                     | AHS5      | S138   | 0.033                                         | 7.33        | 0.002                                | 11.67       | 0.002                                | Sensitive only |
| Ras GTPase-activating protein-binding protein 1   | SsSsPAPADIAQTVEQEDLR            | G3BP1     | S232   | 0.000                                         | Sensitive only | 0.013                                | Sensitive only | 0.013                                | Sensitive only |
| Inositol 1,4,5-trisphosphate receptor type 3      | VAsFSISPSSSR                      | ITPR3     | S1832  | 0.025                                         | 4.25        | 0.000                                | 5.50        | 0.000                                | 5.50        |
| Transcription factor AP-1                        | LASPELER                        | JUN       | S73    | 0.022                                         | Resistant only | 0.002                                | Resistant only | 0.022                                | Resistant only |
| Thymidine kinase, cytosolic                      | LFAPQQLQcQsPAN                   | TKI       | S231   | 0.000                                         | Sensitive only | 0.002                                | Sensitive only | 0.002                                | Sensitive only |
| Thymidine kinase, cytosolic                      | scINLPTVLPsPSK                   | TKI       | S13    | 0.001                                         | Sensitive only | 0.020                                | Sensitive only | 0.020                                | Sensitive only |
| Lamin-B1                                         | AGGPfTTfLsPTR                    | LMNB1     | S23    | 0.025                                         | Resistant only | 0.001                                | Resistant only | 0.001                                | Resistant only |
| Microtubule-associated protein 1B                | VQSELEGKSLP                     | MAP1B     | S1779  | 0.044                                         | Resistant only | 0.001                                | Resistant only | 0.001                                | Resistant only |
| Microtubule-associated protein 1B                | SPSLSPSPPsPLEK                   | MAP1B     | S1265  | 0.020                                         | Resistant only | 0.020                                | Resistant only | 0.020                                | Resistant only |
| Mitogen-activated protein kinase 1               | VADPDHHTGFLITEYATR               | MAPK1     | Y187   | 0.043                                         | 0.21        | 0.020                                | Resistant only | 0.002                                | Resistant only |
| Phosphatidylserine synthase 2                    | DAggPRPEsPVPAfGR                 | PTDS2     | S16    | 0.004                                         | Resistant only | 0.002                                | Resistant only | 0.002                                | Resistant only |
| Epidermal growth factor receptor                 | GSTAENAfEyLR                     | EGFR      | Y1197  | 0.000                                         | Sensitive only | 0.019                                | Sensitive only | 0.019                                | Sensitive only |
| Epidermal growth factor receptor                 | RPAoSVQNFPYHfNQLPNAPfSR          | EGFR      | Y1110  | 0.002                                         | Sensitive only | 0.030                                | Sensitive only | 0.030                                | Sensitive only |
| Epidermal growth factor receptor                 | NGLfScPlfEDsFLfQR                | EGFR      | S1064  | 0.006                                         | Sensitive only | 0.006                                | Sensitive only | 0.006                                | Sensitive only |
| Epidermal growth factor receptor                 | GSHQfSLfNPDPsQQDFFPK             | EGFR      | Y1172  | 0.008                                         | Sensitive only | 0.012                                | Sensitive only | 0.012                                | Sensitive only |
| Epidermal growth factor receptor                 | RPAfSfVfNPYfHNQLPNAPfSR          | EGFR      | S1104  | 0.012                                         | Sensitive only | 0.012                                | Sensitive only | 0.012                                | Sensitive only |
| Epidermal growth factor receptor                 | mHLPsfPTDSfNYFfR                 | EGFR      | S991   | 0.039                                         | Sensitive only | 0.039                                | Sensitive only | 0.039                                | Sensitive only |
| Protein name                                      | Peptide                                      | Gene     | Site     | 231, 436, 1187, 1937 versus 1806 & 468 | 231 & 436 versus 1806 & 468 | 1187 & 1937 versus 1806 & 468 |
|-------------------------------------------------|----------------------------------------------|----------|----------|----------------------------------------|-----------------------------|--------------------------------|
| Epidermal growth factor receptor                | ELVEPLPGEAPNQALLR                            | EGFR     | T693     | 0.003 0.16                             | 0.025 0.13                  |                                |
| Isoform 2 of hepatocyte growth factor receptor  | VHPHLDR                                      | MET      | T977     | 0.000 0.17                             | 0.002 0.17                  | 0.002 0.17                     |
| Heterogeneous nuclear ribonucleoproteins A2/B1 | GGGGNFGPFGPcGSF                               | HNRNPA2B1| S225     | 0.000 Sensitive only                    | 0.013 Sensitive only        | 0.013 Sensitive only           |
| Heterogeneous nuclear ribonucleoproteins A2/B1 | GGGNFPGFDsR                                   | HNRNPA2B1| S212     | 0.003 0.17                             | 0.006 Sensitive only        |                                |
| Isoform PML-5 of protein PML                    | TPAsPHF                                      | PML      | S583     | 0.025 Resistant only                    | 0.006 Resistant only        |                                |
| Isoform 2 of dual specificity protein kinase TTK| VPVNLNLsPDcDVK                                | TTK      | S240     | 0.035 Sensitive only                    | 0.006 Resistant only        |                                |
| PDZ and LIM domain protein 4                    | IHIDPEIQDGsPTTTR                              | PDLM4    | S112     | 0.031 8.00                             | 0.009 12.00                 | 0.037 4.0                      |
| Heat shock factor protein 1                     | VKEEPsPPQSPR                                  | HSFI     | S303     | 0.026 Resistant only                    | 0.038 Resistant only        | 0.021 Resistant only           |
| Isoform 2 of serine/arginine-rich splicing factor II | LNHVAAGLVSPLKL                                | SRSFII   | S207     |                                | 0.025 0.25                  |                                |
| Isoform 4 of acetyl-CoA carboxylase 1           | SSsGLHLV                                      | ACACA    | S117     | 0.005 Resistant only                    | 0.003 Resistant only        | 0.016 Resistant only           |
| Serine/threonine-protein kinase PAK 1           | sVIEPLPTPTR                                   | PAK1     | S181     | 0.005 Sensitive only                    |                                |                                |
| Beta-2-syntrophin                               | GPAGEGAsPPVR                                   | SNTB2    | S110     | 0.034 2.31                             | 0.002 3.25                  |                                |
| Beta-2-syntrophin                               | GLGPPsPPAPP                                   | SNTB2    | S95      | 0.000 3.00                             |                                |                                |
| Cullin-4A                                       | KGSFSALVGR                                     | CUL4A    | S10      | 0.012 4.38                             | 0.000 5.75                  |                                |
| Isoform 2 of protein scribble homolog           | ALsPAEL                                       | SCRIB    | S1405    | 0.029 Resistant only                    | 0.005 Resistant only        |                                |
| Isoform 2 of protein scribble homolog           | RVsLVADDLR                                    | SCRIB    | S1297    | 0.005 0.33                             |                                |                                |
| Isoform 2 of protein scribble homolog           | NSsLEISSIDR                                   | SCRIB    | S1139    | 0.021 3.50                             |                                |                                |
| Isoform 2 of protein scribble homolog           | LPPLLPPsPPGRL                                 | SCRIB    | S772     | 0.019 0.41                             |                                |                                |
| Src substrate contactin                         | LQHLeSQQDYK                                   | CTNN     | Y421     | 0.035 Sensitive only                    |                                |                                |
| Pleckstrin homology-like domain family B member 1 | GGHERPPsPGLR                                  | PHLDB1   | S324     | 0.035 Resistant only                    | 0.010 Resistant only        |                                |
| Isoform 2 of pleckstrin homology-like domain family B member 2 | ALsPLPTR                                    | PHLDB1   | S470     | 0.005 0.14                             |                                |                                |
| Isoform 2 of actin filament-associated protein 1 | SGTSPPsPVFR                                   | AFAPI    | S752     | 0.013 Resistant only                    | 0.006 Resistant only        | 0.037 Resistant only           |
| Actin-binding protein anillin                   | AAsPPPRPLLSNASATPVGR                          | ANL      | S182     | 0.000 0.12                             | 0.004 0.24                  | 0.000 Sensitive only           |
| Myelin expression factor 2                      | AEVPAGTGGdSPHLQPAEPGEPR                      | MYEF2    | S17      | 0.013 Resistant only                    | 0.005 Resistant only        | 0.038 Resistant only           |
| CAP-Gly domain-containing linker protein 2      | KGlGTALQEAKL                                  | CLIP2    | S352     | 0.014 7.00                             |                                |                                |
| Serine/arginine repetitive matrix protein 2     | SSsPVTELASR                                   | SRRM2    | S1103    | 0.018 2.25                             | 0.02 2.50                   |                                |
| Serine/arginine repetitive matrix protein 2     | MAPALSGANLTsPr                                | SRRM2    | S2382    | 0.005 Sensitive only                    | 0.049 Sensitive only        | 0.049 Sensitive only           |
| Serine/arginine repetitive matrix protein 2     | AGMSSNQssISVYLDAVPR                           | SRRM2    | S1404    | 0.035 Sensitive only                    |                                |                                |
| Serine/arginine repetitive matrix protein 2     | DIPRIsPr                                      | SRRM2    | T1472    | 0.035 Sensitive only                    |                                |                                |
| Serine/arginine repetitive matrix protein 2     | ScFEssPPDPHELK                                | SRRM2    | S876     | 0.044 2.20                             |                                |                                |
| Serine/arginine repetitive matrix protein 2     | ALPQIPPrR                                    | SRRM2    | T1492    | 0.02 0.50                              |                                |                                |
| Serine/arginine repetitive matrix protein 2     | MALPPOEDATAsPPR                               | SRRM2    | S1797    | 0.030 0.40                             |                                |                                |
| Targeting protein for Xklp2                     | SSDQPLTVnPsPK                                 | TPX2     | S738     | 0.003 0.39                             | 0.010 0.33                  | 0.022 0.44                     |
| Nucleoprotein TPR                               | TDGFPEAHsSPQVAVPR                              | TPR      | S2155    | 0.028 0.50                             |                                |                                |
| Vimentin                                        | SLYAsPPGVTATR                                 | VIM      | S56      | 0.025 Resistant only                    | 0.01 Resistant only         |                                |
| Vimentin                                        | LRsSVPGVHR                                   | VIM      | S73      | 0.039 Resistant only                    | 0.01 Resistant only         |                                |
the identification of a variety of biomarkers and signaling pathways in order to arrive at the best treatment strategy. It is important to identify aberrations in TNBC subtypes that cause these tumors to be resistant and unresponsive to chemotherapeutic treatments. Protein phosphorylation plays a crucial role in cellular signal transduction pathways. When activated, protein kinase binds and phosphorylates a specific substrate to mediate preprogrammed protein function [29, 30]. To find potential biomarkers that could predict the patient’s response to chemotherapy and potential targets to improve TNBC treatment, we profiled phosphorylated peptides in TNBC cell lines with different sensitivities to a variety of chemotherapy drugs.

Label-free quantification was favored in this study since it has the largest dynamic range and highest proteome coverage—a prerequisite for the objective of this study as protein phosphorylation is a transient process and can be found with varying concentrations [31, 32]. Fractionation via
Rows: objective function: $R = 0.002$

Sum of all pairwise distances of neighboring rows (path length): $S = 1452.740$

Columns: Objective function: $R = 0.690$

Sum of all pairwise distances of neighboring columns (path length): $S = 144.371$

Linkage rule: complete linkage

Dissimilarity: Euclidean distance

The colors scale:

Min = $-2.04$  0.0  Max = $2.04$

Figure 3: Phosphopeptides with differential abundance in TNBC cell lines. The hierarchical cluster displayed differential phosphopeptides between resistant and sensitive cell lines by Permutmatrix software. Only phosphopeptide changes with $P$ values less than 0.05 were loaded for the analysis. Hierarchical clustering validated the IC50 data that helped classify these TNBC cell lines into two dissimilar groups: chemotherapy-sensitive (MDA-MB-468 and HCC1806) and chemotherapy-resistant (MDA-MB-436, MDA-MB-231, HCC1937, and HCC1187).

Figure 4: Protein network displaying associations between proteins found in the six TNBC cell lines using String database 9.05. Green lines represent neighborhood evidence; blue lines indicate cooccurrence evidence; purple lines indicate experimental evidence; light blue lines indicate database evidence; black lines indicate coexpression evidence.
SCX was also utilized in this study to decrease the sample complexity and thus improve the identification. Software as well as several computer-based algorithms was also used to correct any inconsistencies and to increase reliability, thus allowing for more accurate results. As shown in Figure 3, the phosphopeptide clustering data perfectly matched the drug sensitivity data (Table 1). These results gave additional proof that the quantification and identification system used was reliable and potentially had predictive value.

Because different phosphosites in a protein may trigger either protein activation or inactivation, we used phosphosite instead of phosphoprotein as unit for quantification. The functions of proteins will be discussed according to the changes of phosphosites. Among the dramatically altered phosphoproteins identified in the current study, many have also been reported to be important in tumor progression and/or drug resistance. Our results further support the roles of these proteins in TNBC drug resistance and offer new insights for future studies. Some new phosphorylated sites found in this study together with several of the previously reported protein phosphosites were connected for the first time to TNBC drug resistance. The important signaling changes are discussed below.

Transcription factor AP-1 (AP-1) is a multiprotein transcription factor and a member of the Jun and Fos protooncogenic family. Previous studies have linked the activated AP-1 and its family members to increased tumorigenesis, metastasis, and invasion [33, 34] as well as drug resistance [35, 36]. Overexpression of phosphorylation at Ser73 of c-Jun was reported to be responsible for the development of multidrug resistance in colorectal cancer cells [37]. In the current study phosphorylated Ser73 of c-Jun was only found in the resistant cell lines, suggesting AP-1 is important in TNBC drug resistance. The overexpression and activation of promyelocytic leukemia protein (PML) is known to induce the transcriptional activation of AP-1 [38, 39]. In this study, we also found an upregulation of Ser583 on PML in drug resistant cell lines, a new phosphosite which has not been previously described. Our data suggests that this phosphosite provokes the activation of PML, which may lead to TNBC drug resistance through the activation of AP-1.

Heat Shock Factor 1 (HSF-1) is a master regulator for the transcription and heat shock proteins (HSPs) and was reported to induce a multidrug resistance phenotype through constitutive activation of the multidrug resistance gene 1 (MDR-1) [40]. In the current study phosphorylation of Ser303 on HSF-1 was identified to be upregulated in the resistant cell lines. Dai et al. proposed that phosphorylation of Ser303 induced a slow repression of HSF-1 allowing for the accumulation of the HSPs that are crucial for cell growth and recovery [41]. The above evidence suggested that Ser303 phosphorylation of HSF-1 might play an important role in TNBC drug resistance. In addition, both HSF-1 and AP-1 were capable of activating vimentin gene and could be responsible for its overexpression [42–44]. Vimentin is a well-recognized biomarker in epithelial to mesenchymal transition (EMT) and has been associated with metastasis, poorer prognosis, and cell motility in various types of cancer [45]. In the current study, Ser73 and Ser56 on vimentin were found to be phosphorylated in the resistant TNBC cell lines but were absent in the sensitive cell lines. Interestingly, cyclin-dependent kinase 5 (Cdk5) was reported to mediate phosphorylation at Ser56 of vimentin [46]. Ser23 of Lamin B1 (LMNB1) was also identified as an upregulated phosphosite in the resistant cell lines in this study. Others have shown that Ser23 is directly phosphorylated by Cdk5 as well [47]. Taken together, Cdk5 might be activated in drug resistant TNBC cell lines and might phosphorylate LMNB1 and vimentin, leading to EMT and drug resistance in TNBC.

It has been reported that epidermal growth factor receptor (EGFR) plays a significant role in hepatocyte growth factor receptor (HGF/c-Met) mediated biological activities [48]. Activation of HGF is indicative of aggressive tumor pathology, including enhanced proliferation and invasion [48]. EGFR might also promote the multiple drug resistance (MDR) phenotypes in breast cancer cells via accelerating the G1/S transition [49]. Furthermore, Bagowski et al. reported that EGFR phosphorylation at Thr654 and Thr669 by PRKD1 inhibits EGF-induced MAPK8/JNK1 activation [50]. Their studies showed that activation of EGFR and HGF might contribute to drug resistance of breast cancer through the downregulation of phosphosites such as Thr654 and Thr669 of EGFR. In the current study, the phosphosites Thr-693, Tyr-1197, and Tyr-1110 on EGFR and Thr977 on HGF were found to be downregulated in resistant cell lines, suggesting a release of negative regulation of EGFR and HGF functions in these cells. Downregulation of these phosphosites might increase EGFR and HGF activity and led to drug resistance of TNBC cell lines.
It is noticeable that many of the changed phosphoproteins found in the current study were involved in mRNA processing including heterogeneous nuclear ribonucleoprotein A2/B1, serine/arginine repetitive matrix 1 and matrix 2, eukaryotic translation initiation factor 4 gamma-1, and several others. As reviewed by Eblen, alternative splicing is a normal cellular process that can be manipulated by a cancer cell to enhance survival in response to chemotherapeutic treatment [51]. We also found the changes of phosphorylation status of some microtubule related proteins and DNA binding proteins in the current study (Figure 4 and Table 2). All these findings can be important in future TNBC drug resistance studies.

5. Conclusion

The current study has shown that proteomic analysis is a powerful tool for profiling of the phosphorylation patterns and may help better understand drug resistant TNBC cells. Our data suggested that PML, AP-1, and HSF-1 were preferentially activated in resistant TNBC cells and might promote downstream signals including vimentin activation. In addition, our study also suggested that Cdk5 might also promote vimentin and LMNB1 activation leading to an increased EMT in the resistant TNBC cells. We are also reporting on the potential roles of EGFR and HGF in the promotion of a multiple drug resistance (MDR) phenotype in TNBC. We have identified several signaling pathways that may work together to mediate the drug resistance in TNBC (Figure 5).

Conflict of Interests

The authors declare that there is no conflict of interests.

Authors’ Contribution

Morris Kohanfars, Huan Ming Hsu, Puneet Souda, and Joe Capri contributed equally to this study.

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