

# Global proteomic profiling of phosphopeptides using electron transfer dissociation tandem mass spectrometry

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Electron transfer dissociation (ETD) is a recently introduced mass spectrometric technique that provides a more comprehensive coverage of peptide sequences and posttranslational modifications. Here, we evaluated the use of ETD for a global phosphoproteome analysis. In all, we identified a total of 1,435 phosphorylation sites from human embryonic kidney 293T cells, of which 1,141 (~80%) were not previously described. A detailed comparison of ETD and collision-induced dissociation (CID) modes showed that ETD identified 60% more phosphopeptides than CID, with an average of 40% more fragment ions that facilitated localization of phosphorylation sites. Although our data indicate that ETD is superior to CID for phosphorylation analysis, the two methods can be effectively combined in alternating ETD and CID modes for a more comprehensive analysis. Combining ETD and CID, from this single study, we were able to identify 80% of the known phosphorylation sites in >1,000 phosphorylated peptides analyzed. A hierarchical clustering of the identified phosphorylation sites allowed us to discover 15 phosphorylation motifs that have not been reported previously. Overall, ETD is an excellent method for localization of phosphorylation sites and should be an integral component of any strategy for comprehensive phosphorylation analysis.

bioinformatics | motifs | phosphorylation | signal transduction | systems biology

Most cellular processes are regulated by posttranslational modifications (e.g., acetylation and tyrosine phosphorylation), identifying the modified amino acid is relatively straightforward because they are quite stable in the presence of the energy required for collision-induced dissociation (CID) experiments. For other posttranslational modifications [e.g., O-linked *N*-acetylglucosamine (O-GlcNAc) and phosphorylated serine and threonine residues], however, localization is substantially more difficult because the peptides either lose the modification in a charge separation process (O-GlcNAc) (1–3) or by a  $\beta$ -elimination event with a neutral loss of phosphoric acid (e.g., phosphoserine into dehydroalanine). In 1998, Zubarev *et al.* (4) described a new fragmentation technique called electron capture dissociation (ECD) as a gentler fragmentation technique compared with CID. More recently, Syka *et al.* (5) and Pitteri *et al.* (6) demonstrated that peptide cations can also be reduced and converted into radicals by reaction with radical gaseous anions, in an electron transfer process. The reduced peptides show similar fragmentation patterns as observed in ECD experiments, and the process is designated electron transfer dissociation (ETD). Although ETD has been tested in pilot experiments to localize posttranslational modifications, no large-scale analysis using ETD has yet been published.

In this study, we present a global proteomic profiling of phosphopeptides subjected to fragmentation using ETD in an ion trap mass spectrometer. A total of 84,000 ETD and CID tandem MS (MS/MS) spectra from 130 liquid chromatography (LC)-MS/MS runs using three different proteolytic enzymes (Lys-C, trypsin, and

Glu-C) allowed us to identify 1,435 unique phosphorylation sites from proteins encoded by 500 genes, of which 1,141 (~80%) had not been described previously. Using identical samples for ETD and CID analysis, we found that ETD was superior to CID both in the number of phosphopeptides identified as well as amino acid sequence coverage per phosphopeptide. Importantly, from a single sample, our strategy was able to identify 294 of 368 phosphorylation sites (368 phosphorylation sites were previously known in the literature for the phosphopeptides identified in our study, out of which we were able to identify 294) previously reported (80%) in phosphopeptides characterized in our analysis. This number is significant because the phosphorylation sites described in the literature have mostly been discovered through decades of research on individual proteins.

Finally, we took advantage of the large number of phosphorylation sites identified in this study to carry out a bioinformatics analysis to identify novel phosphorylation motifs. Using a hierarchical clustering approach to identify potential phosphorylation motifs, we identified 68 motifs, of which 15 were previously undescribed, illustrating the power of combining experimental and computational approaches for revealing hidden signatures. Overall, our studies establish ETD as an essential component of any comprehensive phosphoproteomics analysis.

## Results

**Electron Transfer Dissociation (ETD) of Phosphopeptides.** To evaluate ETD for a global analysis of the phosphoproteome, we analyzed phosphopeptides enriched using TiO<sub>2</sub> purification on an ion trap equipped with ETD capability. We first decided to use Lys-C generated peptides for this study as it has been reported that multiple charged peptides are fragmented more favorably in ETD experiments (6). Lysates from human embryonic kidney 293T cells treated with serine/threonine and tyrosine phosphatase inhibitors were separated by reversed phase chromatography into 30 fractions, each of which was split into three sets (Fig. 1). One of the sets was subjected to an in-solution digestion by using Lys-C followed by enrichment of phosphopeptides by using TiO<sub>2</sub> as described recently (7). The phosphopeptide-enriched fractions were analyzed by using LC-MS/MS (ETD) and 24,622 resulting ETD spectra were searched against the Human RefSeq database. From this experiment, 676 unique peptides were identified of which 606 were

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Abbreviations: CID, collision-induced dissociation; ETD, electron transfer dissociation; MS/MS, tandem MS; LC, liquid chromatography.

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**Table 1. Novel motifs that were identified by hierarchical clustering**

	Novel motif	Occurrence in phosphopeptides
1	pS[E/D]X[E/D][E/D]	55
2	pSPXXXP	31
3	pSPXXXT	27
4	DXXXp[S/T]P	14
5	GGpS	13
6	p[S/T]PPP	12
7	QXp[S/T]P	12
8	PSp[S/T]P	11
9	PPXp[S/T]P	9
10	PPp[S/T]P	9
11	EXSXp[S/T]P	9
12	PXpSPX[R/K]	8
13	PpSXL	7
14	PLp[S/T]P	6
15	TpTP	5

identified were previously undescribed, we reasoned that it is possible that they contain short conserved amino acid sequences around the phosphorylation site, or motifs, that have not been previously described. To test this hypothesis, we used a hierarchical clustering strategy in which sequences surrounding the phosphorylation sites were aligned and grouped to create small clusters (groups of peptides containing certain conserved residues). If a consensus pattern i.e., a similar stretch of amino acids, was present in  $\geq 5$  phosphopeptide sequences, we considered it as a potential motif. This analysis led to identification of a total of 68 motifs. To determine which of these motifs have not been previously described, we took advantage of a compendium of known motifs from the literature that we have recently created (17). We observed a large number of motifs that are known to be substrate motifs for proline-directed kinases ([pS/pT]P; PxpSP) such as MAP kinases, CDK5, and GSK3 kinases (18). In addition, a number of motifs corresponding to casein kinase 2, protein kinase C (PKC), and protein kinase A (PKA) were observed. Overall, of the 1,114 previously undescribed sites, 85% matched at least one known motif. Importantly, this approach also led to the identification of 15 motifs that had not been previously described (Table 1) highlighting the importance of coupling global experimental studies with computational approaches for refining our understanding of biological signals such as motifs.

We mapped the phosphorylation sites identified in this study to 500 unique genes (See Table 2 for a summary of the data). **SI Table 3** shows the top 20 proteins from which phosphorylation sites were identified in this study. The protein with the largest number of identified phosphorylation sites (119 sites) was a splicing coactivator subunit of predicted molecular mass 300 kDa, SRm300 (also referred to as serine/arginine repetitive matrix 2). Interestingly, two related proteins, SRm160 and SRm75, which exist in a complex with

the SRm300 protein, also featured on this list with 25 and 12 sites, respectively, making this probably the most phosphorylated protein complex yet described.

## Discussion

The success of a phosphoproteomics experiment is highly dependent on the use of particular enrichment methods and sample processing steps. Phosphopeptide enrichment protocols employing  $\text{TiO}_2$  and immobilized metal affinity chromatography are biased toward peptides containing negatively charged residues. This bias implies that it is possible that certain phosphorylation motifs are overrepresented whereas others are underrepresented in the enriched phosphopeptide data set. Another parameter that is affected by the presence of acidic residues is cleavage by proteases. It is known that trypsin does not cleave efficiently when an acidic amino acid is located adjacent to arginine or lysine residues. Because of this behavior of trypsin, as demonstrated in this study, the identified phosphorylated tryptic peptides are longer when reagents such as  $\text{TiO}_2$  is used for enrichment, resulting in a higher number of positive charges per peptide. As a result, tryptic peptides are almost as good as Lys-C for phosphorylation analysis by ETD. This finding also highlights the need for allowing greater flexibility in terms of missed cleavage events during a database search. Steps can be taken to minimize this bias toward enrichments of peptides with a number of acidic residues by derivatization (19) or charge based fractionation (20).

In this study, we have demonstrated the advantages of using ETD as a fragmentation method for global phosphoproteomics analysis. In all, when comparing identical fractions we found 60% more phosphopeptides with ETD than with CID. Most studies thus far have used CID as a fragmentation method for phosphorylation analysis in conjunction with tryptic digests. Although, a large number of phosphorylation sites can undoubtedly be discovered by using the conventional CID-based approach, we believe that incorporation of ETD as a fragmentation method will be necessary to obtain more comprehensive coverage as well as to improve the confidence of phosphorylation sites because ETD is a complementary technique to CID. As we have demonstrated, alternating CID and ETD experiments can be easily carried out on existing mass spectrometers and provide an excellent platform to carry out phosphoproteomics analysis. Finally, it is likely that coupling of CID to ETD for peptide identification will be fruitful especially in cases where the peptide coverage is not high such as proteins based on "single peptide identification." Given the central role of mass spectrometric analysis in systems biology approaches today, we believe that inclusion of ETD as a fragmentation method will be advantageous for any proteomic analysis.

## Materials and Methods

**Sample Preparation and Processing.** Human embryonic kidney 293T cells were treated with the phosphatase inhibitors pervanadate and calyculin A (Sigma, St. Louis, MO) for 25 min. The cells were then lysed by ultrasonic treatment followed by nitrogen cavitation (Parr Instrument Company Moline, IL). Cell debris was removed by

**Table 2. A summary of the phosphopeptide dataset reported in this study**

Category	No. of examples
No. of unique phosphorylation sites	1,435
Novel phosphorylation sites identified	1,141
No. of unique phosphorylated proteins	500
Phosphopeptides with 1, 2, 3, or 4 phosphorylation sites	868; 374; 93; 24
Phosphorylated (serine:threonine:tyrosine) residues	1,096:266:73
Phosphopeptides identified by both CID and ETD	129
Protein with the most phosphorylation sites identified: SRm300 (serine/arginine repetitive matrix 2)	119 total (71 novel, 48 known)

centrifugation at  $16,000 \times g$  for 10 min. Urea was added to the protein sample (final concentration: 6 M), followed by reduction, alkylation, and acidification. Five hundred microliters ( $\approx 500 \mu\text{g}$ ) of the protein sample was injected by using a loop onto a reversed phase column (mRP-C<sub>18</sub> High-Recovery Protein Column; Agilent Technologies, Santa Clara, CA) maintained at 80°C. Proteins were separated by using a 1%/min gradient of 0.1% TFA (buffer A) and acetonitrile/0.08% TFA (buffer B) delivered by a binary pump at 800  $\mu\text{l}/\text{min}$  (1100 series; Agilent Technologies) and detected at 280 nm (UV detector 1100 series; Santa Clara, CA). Protein fractions were collected every 30 s, and the resulting fractions were divided into three sets. The fractions were dried down and redissolved in 40  $\mu\text{l}$  of 0.1 M  $\text{NH}_4\text{HCO}_3$  containing either 0.15  $\mu\text{g}$  or 0.3  $\mu\text{g}$  of either trypsin (Promega, Madison, WI), lysyl endopeptidase/Lys-C (Wako Chemicals, Richmond, VA), or endoproteinase Glu-C (Roche Diagnostics GmbH, Penzberg, Germany). Protein fractions were digested overnight at room temperature. For quality control purposes, 7% of selected digested fractions were taken before the phosphopeptide enrichment step and analyzed by LC-MS/MS (CID).

**Phosphopeptide Enrichment using TiO<sub>2</sub>.** The peptides obtained from the digestion step were dried down, and selected fractions were redissolved in 20  $\mu\text{l}$  of 80% acetonitrile, 66 mg/ml 2,5-dihydrobenzoic acid, and 1% TFA and loaded onto a home-built TiO<sub>2</sub> (Glygen Corp., Columbia, MD) microcolumn (1–2 mm) packed in a GelLoader tip, as described by Larsen *et al.* (7). After washing twice with 50  $\mu\text{l}$  of 80% acetonitrile containing 1% TFA, the bound peptides were eluted in 20  $\mu\text{l}$  of 3%  $\text{NH}_4\text{OH}$ , pH 10.5, dried, and redissolved in 5  $\mu\text{l}$  of 0.1% formic acid before LC-MS/MS analysis.

**LC-MS/MS and Data Analysis.** All LC-MS/MS analyses were performed on an Agilent 1100 Series HPLC-Chip/MS system interfaced to a 3-D ion trap mass spectrometer (Agilent 6340; Agilent Technologies) equipped with an ETD source. Peptides were separated by reversed-phase LC with a precolumn/analytical column nano-flow setup (HPLC-Chip cube; Agilent Technologies) and analyzed in either CID only, ETD only, or alternating CID/ETD modes.

Protein identification was performed by using Spectrum Mill Proteomics Workbench Version A.03.03 (Agilent Technologies) searching the human subset of the NCBI RefSeq database. An initial search was performed by using two missed cleavages with complete proteolytic specificity (Trypsin, Lys-C, or Glu-C),  $\pm 4$  Da for the precursor mass,  $\pm 0.7$  Da for the fragment masses, 40% minimum scored peak intensity, and 5+ for the maximum ambiguous charge state for the spectra with precursors of unassigned charge state. Phosphorylation of serine, threonine, and tyrosine residues, together with oxidation of methionines, was allowed as variable modifications. After this first search, spectra

were manually validated (see below for details), and a smaller database was created by using the proteins identified by these validated spectra. Further searches were performed against this database, allowing for semienzymatic cleavages, and up to four missed cleavages for spectra that contained a sequence tag  $>4$ .

To validate that a protein was actually present in the sample, at least one of the peptide identifications must exhibit a confident score ( $>14$ – $16$  depending on charge state) and a large  $\delta$ -forward reverse score ( $>5$ ) along with at least three complementary c and z cleavages within the matched sequence. For peptides with a lower score from the same protein, the peptides must still exhibit a large sequence tags of matched c and/or z ions but do not require a large score and/or delta-reverse score. Further, peptide matches that did not meet the above criteria were allowed if a confident identification of the same peptide was found in the same data set. In a second step, peptides were validated in “peptide” mode where the remaining peptide identifications were evaluated individually. First, any peptide with a score  $>16$  was automatically validated. For the remaining peptides, each spectrum was inspected independently. In general, 5+ identifications required a score  $>14$ , 4+ a score  $>12$ , 3+ a score  $>9$ , and 2+ with a score  $>7$  to be validated as an individual peptide. The counting of peptides and phosphopeptides was carried out in accordance with recently published guidelines (21) to avoid redundancy.

**Bioinformatics Analysis of Phosphorylation Sites.** For hierarchical clustering, the phosphorylated serine/threonine/tyrosine residues identified in this study and the flanking 7 aa on both sides were used to generate a library of 1,435 15-mer peptide sequences. A hierarchical clustering algorithm was developed by using Python shell scripting (version 2.3) for identifying conserved amino acid sequences, or motifs, present among the phosphopeptides. The algorithm was based on agglomerative hierarchical clustering in which each peptide sequence is initially placed into its own group. Each of these groups contains only a single peptide, referred to as a singleton. All groups were compared with each other and the closest groups were merged into a single new group if the distance between a specific pair of group was less than the threshold distance. The threshold for the distance function was provided by BLOSUM62 matrix, based on a likelihood method estimating the occurrence of each possible pair wise substitution, which assigns a score to every identity or substitution based on the observed frequencies of such occurrences in alignments of related proteins (22). Clustering is continued until the distance between the closest pair is greater than this threshold.

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