Mouse primary T cell phosphoyrosine proteomics enabled by BOOST

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Abstract

The Broad Spectrum Optimization of Selective Triggering (BOOST) approach was recently developed to increase the quantitative depth of the tyrosine phosphoproteome by mass spectrometry-based proteomics. While BOOST has been demonstrated in the Jurkat T cell line, it has not been demonstrated in scarce mice primary T cells. Here, we show the first phosphotyrosine proteomics experiment performed in mice primary T cells using BOOST. We identify and precisely quantify more than 3,000 unique pTyr PSMs using only 1 mg of protein from T cell receptor-stimulated primary T cells from mice. We further reveal the importance of the phase-constrained spectrum deconvolution method (Φ SDM) parameter on Orbitrap instruments that, when disabled, enhances quantitation depth, accuracy, and precision in low-abundance samples. Using

samples with contrived ratios, we find that disabling Φ SDM allows for up to a twofold increase in the number of statistically significant intensity ratios detected while enabling Φ SDM degrades quantitation, especially in low-abundance samples.

Keywords:

- Mice
- T cell
- BOOST
- TMT
- SH2 superbinder
- Phosphotyrosine proteomics
- Phase-constrained spectrum deconvolution method

Introduction

Kinase signaling cascades regulate key cellular processes including growth, differentiation, and transcriptional regulation. In T cells, binding of antigen-loaded peptide major histocompatibility complex on antigen-presenting cells to the T cell receptor (TCR) initiates early tyrosine kinase-mediated signaling, leading to serine/threonine kinase activation that regulates transcriptional activation. Signal initiation from the TCR begins via recruitment of the Src family tyrosine kinases Lck and Fyn, which phosphorylate tyrosine residues in immunotyrosine activation motifs (ITAMs) on the intracellular domain of TCR complex subunits $TCR\zeta$, $CD3\epsilon$, $CD3\delta$, and $CD3\gamma$. Next, the Syk-family tyrosine kinase Zap70 binds to phosphorylated ITAMs, is itself phosphorylated by TCR-proximal Lck, and directed toward substrates associated with the critical scaffolding protein linker for activation of T cells (LAT) by Lck.

Zap70 and the Lck-activated Tec-family tyrosine kinase Itk phosphorylate and activate many LAT-associated proteins, culminating in serine/threonine kinase activation upstream of cytokine expression and actin cytoskeletal regulation. ^{1,4} Despite the importance of tyrosine phosphorylation in the early stages of TCR signaling, tyrosine phosphorylation is scarce, accounting for less than 1% of all phosphorylation events. ^{5,6}

Due to the scarce nature of tyrosine phosphorylation, large-scale phosphotyrosine (pTyr) proteomic studies of TCR signaling in mice primary T cells are often impaired by low yield. Recently, Locard-Paulet et al. performed a phosphoproteomic study by antibodystimulating 100 million CD4⁺ T cells per replicate before phophotyrosine enrichment using the pTyr-1000 enrichment kit. Using this approach, Locard-Paulet et al. identified a total of 254 unique pTyr sites from 786 unique pTyr peptides, which is comparable to phosphoproteomic studies of TCR and chimeric antigen receptor signaling in primary human T cells.^{8–10} Phosphotyrosine-specific enrichment methods provide improved pTyr sequencing compared to the more commonly used global phosphopeptide enrichment strategies like immobilized metal affinity chromatography (IMAC) or titanium dioxide (TiO_2) . ^{11,12} One phosphoproteomic study of TCR signaling in mice using 20 million cells per replicate and IMAC phosphopeptide enrichment identified only 77 unique pTyr peptides, ¹³ whereas other studies report 1-2% (about 250 to 700) of their total yield as unique pTyr peptides using IMAC or TiO₂. ^{11,14} As demonstrated in Iwai et al., decreasing the number of cells and therefore the amount of protein input can severely limit pTyr quantitation depth in primary T cells from mice.

To increase the accuracy, precision, and reporducibility of pTyr quantitation in cases of limited protein availability, both experimental and computational approaches are being developed. For example, recent improvements in pTyr enrichment reagents, namely the superbinder SH2 enrichment method, ^{15–20} have improved quantitation depth of the pTyr proteome. ^{21–23} Additionally, the use of isobaric labeling reagents like tandem mass tags (TMT) have allowed for accurate phosphopeptide quantitation in multiplexed samples with a higher

probability of identifying unique peptides compared to label-free quantitation. $^{24-29}$ To improve the spectral quality and speed of acquiring TMT samples on Fourier transfrom-mass spectrometers (FT-MS), instrument settings like the phase-constrained spectrum deconvolution method (Φ SDM) are available. By applying the Φ SDM, FT spectra are deconvolved into frequency distributions, allowing for efficient extraction of the harmonic components of oscillating ions and ultimately achieving higher mass accuracy and resolution in shorter times. 30

Recently, we combined the multiplexing capability of TMT, the selectivity of superbinder SH2, and a carrier channel using broad phosphatase inhibition to develop the broad-spectrum optimization of selective triggering (BOOST) method to increase pTyr quantitation depth in proteomics experiments. 21 During the development of BOOST we used Jurkat T cells, a model system for studying TCR signaling. 31 However the BOOST method has not yet been demonstrated in the more biologically relevant primary T cells from mice. Here, we report the first pTyr proteomics study in primary T cells from mice using the BOOST method. By using predetermined protein input amounts, we show that BOOST increases the sequencing depth of low abundance samples, yielding more than 3,000 unique pTyr peptides in experimental samples. We also show that acquiring samples using the Φ SDM degrades quantitation in low-abundance samples. By using samples with contrived ratios, samples acquired with the Φ SDM disabled have higher replicate reproducibility, are more accurate, and are more precise than equivalent samples acquired with the Φ SDM enabled.

Materials and Methods

Stimulation of mice primary T cells

CD8+ thymocytes from B6 mice were harvested and blasted in cell culture using IL-2. Cells were rested in 1% BSA T cell media for 2 hours at 2×10^6 cells/ml prior to stimulation. To initiate T cell stimulation, 25 μ g/mL of biotin-labeled α -CD3 antibody (Clone < C305?>

and 25 μ g/mL streptavidin were added to the cells resuspended at 1 × 10⁸ cells/ml for 5 minutes at 37°C. After 5 minutes of stimulation, cells were lysed with 1% (w/v) sodium dodecyl sulfate (SDS) in 100 mM Tris-HCl (pH 7.6). Pervanadate treatment for the carrier channel sample was performed by incubating cells with 500 μ M PV (prepared by mixing equal volume of 1 mM sodium orthovanadate and 1 mM hydrogen peroxide) for 20 minutes at 37°C.

Sample processing

Lysate was applied through QIAshredder Mini Spin Column by centrifugation at 20,000×g at 37°C for 5 minutes. Protein concentration was determined using Pierce BCA Protein Assay (Thermo Fisher Scientific, 23225), after which it was reduced by 100 mM dithiothreitol at room temperature for 30 minutes. Lysate was subsequently processed and digested using the filter-aided sample preparation (FASP) method³² as described previously. Digested peptides were collected and acidified by trifluoroacetic acid and desalted using Sep-Pak C18 Cartridge (Waters WAT020515) as described previously. ³³ Desalted peptides were labeled using a Tandem Mass Tag as described previously. ²¹ TMT-labeled peptides were mixed and purified for phosphotyrosine peptides using the Src SH2 domain superbinder as described previously. ²¹

Liquid chromatography tandem mass spectrometry

Offline basic (pH 10) fractionation of peptides was performed on a 100 mm \times 1.0 mm Acquity BEH C18 column (Waters) using an UltiMate 3000 UHPLC system (ThermoFisher Scientific) with a 40-minute gradient from 1% to 40% Buffer B_{basic} into 36 fractions. The 36 fractions were subsequently consolidated into 12 super-fractions (Buffer A_{basic} = 10 mM ammonium hydroxide in 99.5% (v/v) HPLC-grade water, 0.5% (v/v) HPLC-grade acetonitrile; Buffer B_{basic} = 10 mM ammonium hydroxide in 100% HPLC-grade acetonitrile), which were further separated on an in-line 150 mm \times 75 μ m reversed phase analytical column packed in-house

with XSelect CSH C18 2.5 μ m resin (Waters) using an UltiMate 3000 RSLCnano system (ThermoFisher Scientific) at a flow rate of 300 nL/min. Peptides were then eluted using a 65-minute gradient from 5% to 30% Buffer B_{acidic}, followed by a 6-minute gradient 30% to 90% Buffer B_{acidic} (Buffer $A_{acidic}=0.1\%$ (v/v) formic acid in 99.4% (v/v) HPLC-grade water, 0.5% (v/v) HPLC-grade acetonitrile; Buffer $B_{\rm basic} = 0.1\%$ (v/v) formic acid in 99.9% (v/v) HPLC-grade acetonitrile). Data were acquired in data-dependent acquisition (DDA) mode on a Orbitrap Eclipse Tribrid mass spectrometer (ThermoFisher Scientific) with a positive spray voltage of 2.25 kV, multinotch TMT-MS3 settings, 34 and a cycle time was set at 2.5 seconds. At the MS1 level, precursor ions with charge states from 2 to 5 were acquired on the Orbitrap detector with a scan range of $400 - 1600 \ m/z$, $120{,}000$ resolution, maximum injection time of 50 ms, automatic gain control (AGC) target of 800,000, and a dynamic exclusion time of 15 seconds. An isolation window of 0.7 m/z was used to isolate MS1 precursor ions on the quadrupole for MS2 scans. MS2 scans were acquired in centroid mode on the ion trap detector on a scan range of $400-1400 \ m/z$ via higher-energy dissociation (HCD, 33% energy) activation with an AGC target of 5000, maximum injection time of 75 ms. Using synchronous precursor selection (SPS), 34 10 notches were further isolated on the quadrupole using an MS2 isolation window of 3 m/z for MS3 scans, which are acquired on the Orbitrap detector on a scan range of $100 - 500 \ m/z$ in a mass resolution of 50,000 via HCD activation (55% energy) with a AGC target of 250,000 and maximum injection time of 150 ms in centroid mode.

Database Search Parameters and Acceptance Criteria for Identifications

Raw files were processed in MaxQuant³⁵ version 1.6.17.0 using the integrated peptide search engine Andromeda.³⁶ MS/MS spectra were searched against a mouse UniProt database (Mus musculus, last modified 12/01/2019) comprised of 55,412 forward protein sequences. False discovery rate (FDR) for peptide spectrum matches (PSM) was set at 1% using a reverse

decoy database approach. Carbamidomethylation (cysteine) was set as fixed modification, whereas oxidation (methionine), acetylation (protein N-termini) and phosphorylation (serine, threonine, tyrosine) were set as variable modifications. Trypsin enzyme specificity was used with up to 2 missed cleavages. Main search peptide tolerance was set as 5 ppm, while FTMS and ITMS MS/MS match tolerances were set as 20 ppm and 0.5 Da, respectively. MS3 reporter ion mass tolerance was set at 3 mDa, using isotopic correction factors provided by the manufacturer (Lot UK291564, Lot UH283151). The search parameter fil (mqpar.xml) and all MaxQuant output files are provided in Supporting Folder 1.

Data Analysis & Code Availability

All analysis and data visualization were preformed on Ubuntu 20.04 LTS in the Windows Subsystem for Linux version 2 using Python 3.8.10 with the packages "Matplotlib" (Version 3.3.2), "SciPy" (Version 1.7.3), "pandas" (Version 1.2.3), "NumPy" (Version 1.19.2), "Biopython" (version 1.78), and "matplotlib-venn" (version 0.11.6) and is available in Supporting Folder 1. Analysis of unique PSMs was performed using the MaxQuant output file "evidence.txt" (Supporting Folder 2). Unique PSMs were defined by a non-redundant amino acid sequence (including posttranslational modifications), the charge state of the peptide, and the least number of missing values across all TMT channels. In the cases where redundancy was still present, we kept the peptide with the highest median reporter intensity. For assigning flanking sequences to each peptide and generating Supporting Figure 1, the MaxQuant output file "Phospho (STY)Sites.txt" (Supplementary Folder 2) was used. For determining previously annotated pTyr sites we used the PhosphoSitePlus[®] (www.phosphosite.org)³⁷ posttranslational modification database file "Phosphorylation_site_dataset.txt" (Supporting Folder 1). Before analysis, all peptides at a 1% FDR flagged as "potential contaminants" or "reverse hits" were removed, and reporter ions from the PV-treated sample (TMT126) and the Blank channel (TMT127N) were excluded from further analysis unless otherwise stated. Statistical significance between the mean corrected reporter intensities for 1.0 mg,

0.3 mg, and 0.1 mg protein input samples was determined using unpaired Student's T-tests to calculate p-values before correcting for multiple hypotheses (generating q-values) using the method of Benjamini & Hochberg. 38 For all comparisons, statistical significance was only attained for peptides where reporter intensity values were present for all three replicates. In line with the previous literature, we did not impute or interpolate missing values at any point during data analysis. 21,22 To evaluate replicate reproducibility, we performed least squares linear regression³⁹ on pairwise comparisons between replicates for each protein input amount in a given experiment, removing peptides for which one or both replicates contained missing values. For all volcano plots, we plotted $-\log_{10}(q\text{-value})$ as a function of log₁₀(Ratio of Mean pTyr Intensities) for comparisons between 1.0 mg and 0.1 mg, 1.0 mg and 0.3 mg, and 0.3 mg and 0.1 mg of protein input for each TMT mix. For cases where volcano plots were constructed for each portion of a Venn diagram, separate volcano plots for each overlapping portion were constructed using the reporter intensity data from each experiment. For BOOST Factor plots, only pTyr peptides with at least one reporter ion value were used, and we used the following equation to calculate BOOST Factor for each pTyr peptide:

$$\begin{aligned} \text{BOOST Factor} &= \frac{\text{Total reporter ion current}_{\text{BOOST}}}{\text{Total reporter ion current}_{\text{Experimental}}} \\ &\approx \frac{1.0 \text{ mg PV intensity}}{\text{Sum}(1\text{mg}_{\text{R1-R3}} + 0.3\text{mg}_{\text{R1-R3}} + 0.1\text{mg}_{\text{R1-R3}})}. \end{aligned} \tag{1}$$

The results of all analysis are provided in Supporting Tables 1-6, including references to the identification number(s) for each peptide in the original MaxQuant output file(s).

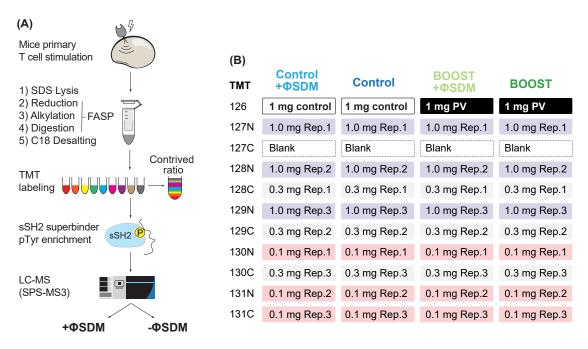


Figure 1: Schematic of (A) experimental workflow and (B) TMT mix and channel design.

Results

Experimental Design & Rationale

In this study, we sought to determine the performance of the recently developed BOOST method for pTyr proteomics in primary T cells from mice. In short, BOOST is a method used to increase the precursor ion triggering and fragmentation of pTyr-containing peptides using a pervanadate (PV) treated sample as a carrier channel in multiplexed TMT experiments, thus increasing quantitation depth of low-abundance posttranslational modifications. ²¹ Our design is similar to that of our previous BOOST studies, ^{21,22} using one 1.0 mg PV treated sample (or 1.0 mg protein control) and predetermined protein samples from 5-minute CD3-stimulated primary mouse T cells to define the accuracy and precision of the BOOST method in primary T cells (Figure 1A,B). In PV BOOST experiments, there is potential for reporter ion interference between nearby channels, which can negatively impact quantitation and increase the potential for false positive discoveries. ⁴⁰ In our previous study we found evidence of reporter ion interference from channel 126 (+PV) to 127C, however we found no evidence

of leakage from 126 to 127N. ²² Therefore, we included a "Blank" channel (127C) to catch potential reporter ion interference from the 1.0 mg PV-treated sample (126; Figure 1B). To enrich for pTyr-containing peptides, we used the superbinder SH2 method ^{19–21,23} prior to acquisition and analysis by LC-MS and MaxQuant, respectively. To understand how the Φ SDM affects pTyr quantitation in BOOST experiments, our BOOST and control TMT mixes were acquired with (+ Φ SDM) and without the Φ SDM on an Orbitrap Eclipse Tribrid mass spectrometer (Figure 1A). From all experiments (BOOST and control, with and without the Φ SDM), the majority of identified phosphorylation sites were localized to tyrosines (70%) with 94.1% of pTyr sites being assigned with probability > 0.75 (Supporting Figure 1).

Disabling the Φ SDM Increases pTyr Quantitation Depth in BOOST Experiments With No Detectable Ratio Compression or Reporter Ion Interference

To our surprise, disabling the ΦSDM increased the number of pTyr peptide PSMs with quantifiable reporters in both the BOOST and control TMT mixes. In the 1.0 mg PV-treated channels, we observed 5,741 unique pTyr peptide PSMs with the ΦSDM disabled and only 4,839 with the ΦSDM enabled. On average, 1.0 mg protein input samples using BOOST yielded 2,425 quantifiable pTyr peptide PSMs with the ΦSDM disabled compared to 1,066 when the ΦSDM is enabled, a 2.3 fold increase. We observed improvement when disabling the ΦSDM in both 0.3 and 0.1 mg protein input samples in BOOST, with an average of 1,019 and 369 quantifiable pTyr peptides compared to 640 and 142 with the ΦSDM enabled, respectively (Figure 2C,D). The increased quantitation depth also came with fewer missing values. The average percentage of missing data for 1.0 mg, 0.3 mg, and 0.1 mg samples using BOOST dropped from 78.4, 87.0, and 97.1 to 59.0, 82.8, and 93.8 when the ΦSDM was disabled, respectively (Supporting Figure 2C,D). While the control samples did benefit from disabling the ΦSDM, the magnitude of improvement was smaller (1.3-fold

for 1.0 mg, 1.3-fold for 0.3 mg, and 1.7-fold for 0.1 mg; Figure 2A,B) and the percentage of missing values between replicates were similar (Supporting Figure 2A,B). These data suggest that the ΦSDM negatively effects pTyr quantitation depth in both control and BOOST experiments.

Previous literature evaluating the BOOST method suggested that a PV BOOST channel can promote ratio compression and increase reporter ion interference. 40 Therefore, we evaluated whether the PV BOOST channel influenced quantitation in neighboring channels in our experiments. In both control and BOOST samples with or without the Φ SDM enabled, we quantified peptides in the blank channels (Figure 2A-D) and the distribution of reporter ion intensities in the blank channels were markedly lower than all other channels (Supporting Figure 3) as observed previously. ²² The distribution of intensity values in experimental channels were consistent for each replicate in each TMT experiment, although the median intensity value for the BOOST and BOOST+ Φ SDM experiments were lowered and did not align well with the predetermined protein input amounts (Supporting Figure 3). To determine whether the low median intensities were a result of ratio compression, we plotted the ratio of all pTyr peptide PSMs with no missing values (Figure 2E, upper row) and with at least one value (Figure 2E, lower row) in each group. For pTyr peptide PSMs with no missing values, the median ratios between all protein input amounts were similar to the controls with or without the Φ SDM enabled and aligned well with the expected ratios (Figure 2E, upper row). When evaluating ratios where each pTyr peptide PSM contained at least one value, we observed a consistent drop in the median ratio value across all comparisons in all experiments, however the median ratios were still well aligned with the expected ratios (Figure 2E, lower row). Next, we evaluated whether reporter ion interference was prevalent in any experimental channel by evaluating deviation from the mean intensity value for each pTyr peptide PSM present in all replicates in each condition (Supporting Figures 4-6). The mean intensity values for 1.0 mg replicates predicted each individual replicate well in all experiments, with r^2 values greater than 0.94 in all comparisons. We also observed

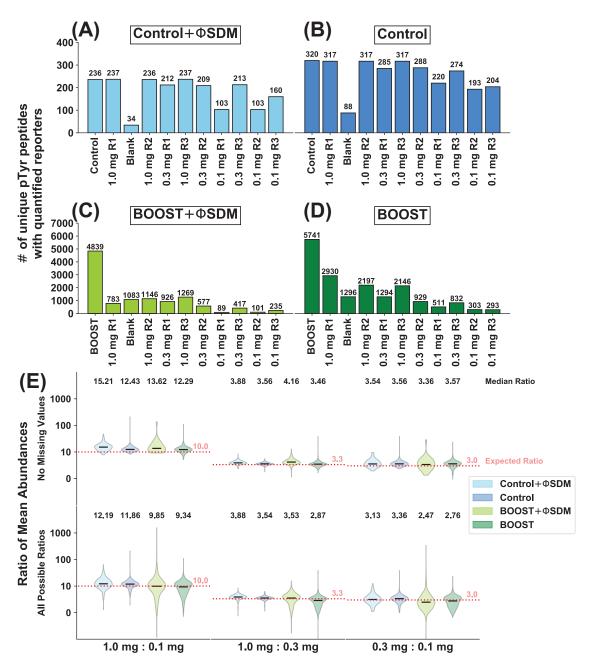


Figure 2: Quantitation depth is improved in BOOST and 1.0 mg Control experiments when the Φ SDM is disabled without detectable ratio suppression. The number of unique pTyr peptides identified in each TMT channel for the (A) 1.0 mg Control experiment with the Φ SDM enabled, (B) 1.0 mg Control experiment with the Φ SDM disabled, (C) BOOST experiment with Φ SDM enabled, (D) BOOST experiment with the Φ SDM disabled. The exact number of unique pTyr peptides is indicated above each bar. (E) Ratio of mean intensities for each unique pTyr peptide observed. Top row depicts ratios with no missing values (n=3 intensity values in each group). Bottom row depicts all possible ratios ($n\geq 1$ intensity values in each group).

high r^2 values (> 0.9) in the 0.3 mg and 0.1 mg replicates in all experiments where the Φ SDM was disabled, however experiments with Φ SDM enabled had noticably lower r^2 values and fewer repeating pTyr peptide PSMs for low abundance samples (Supporting Figures 5,6). Together, these data suggest that ratio compression and reporter ion interference were minimally present in our experiments, if at all .

Disabling the Φ SDM in BOOST Experiments Increases the Reproducibility, Accuracy, Precision of pTyr Quantitation in Low Abundance Samples

Interestingly, we observed a substantial increase in replicate reproducibility after disabling the Φ SDM in both BOOST and control experiments, especially in low abundance samples. We assessed replicate reproducibility by performing simple least squares regression in a pairwise manner on replicates for 1.0 mg, 0.3 mg, and 0.1 mg protein inputs for BOOST and control experiments acquired with and without the Φ SDM (Figure 3A, Supporting Figures 7-10). When the Φ SDM was disabled, we observed higher average values for the coefficient of determination (r^2) , a measure of the linear relationship between data, in all conditions. This effect was clearest in the low abundance samples, where the average r^2 for BOOST experiments with 0.1 mg of protein increased from 0.527 to 0.775 by disabling the Φ SDM (Figure 3A, Supporting Figures 7, 8). We observed similar results in the control samples, where disabling the Φ SDM increased the r^2 from 0.566 to 0.863 (Figure 3A, Supporting Figures 9, 10). When comparing the BOOST and control samples, we observed a modest decrease in replicate reproducibility when using BOOST for all protein input amounts (Figure 3A). However, the average number of peptides with quantifiable reporter ions increased 6 to 7-fold using BOOST (Supporing Figures 7, 9). Our data suggest that disabling the Φ SDM increases the linear relationship between replicates and, therefore, replicate reproducibility in both BOOST and control experiments.

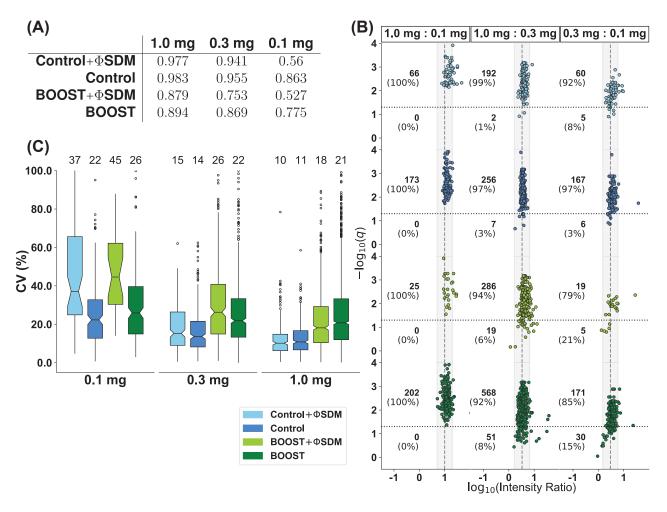


Figure 3: With the Φ SDM disabled, replicate intensity values are more reproducible, more significant ratios of pTyr peptides are observed, and the coefficient of variation for each condition are consistent. (A) Table showing the average coefficient of determination (r^2) from least squares linear regression preformed on replicates. (B) Volcano plot showing contrived ratios for each TMT mix as indicated. The numbers and proportions [in percentages] of ratios above and below a q-value of 0.05 [horizontal black, dotted lines] are indicated. The grey, dashed line indicates the theoretically expected ratio, and the grey shaded area represents 2-fold above and below theoretically expected ratios. (C) Box-and-whisker plots showing the percentage coefficient of variation of the triplicate intensities for each protein input as indicated. The median coefficient of variation percentages are show above each boxplot. Color labels apply to (B) and (C).

In addition to increasing reproducibility, disabling the Φ SDM also increased the accuracy and precision of pTyr quantitation. We assessed accuracy by observing clustering around the theoretically expected peptide intensity ratios in volcano plots (Figure 3B). In both the control and BOOST experiments with the Φ SDM disabled, we observed tight clustering of values around theoretical truth, especially in the 1.0 mg to 0.1 mg comparison. In contrast, enabling the Φ SDM decreased both clustering around the theoretical truth and the number of peptides with a statistically significant difference in mean reporter intensity. Disabling the ΦSDM lead to a 2.8-fold increase in statistically significant ratios between the 0.3 mg and 0.1 mg protein input conditions for control experiments, and a 9.0-fold increase for BOOST experiments (Figure 3B). The increased number of statistically significant ratios with the ΦSDM disabled was coupled with an increase in quantitative precision in low abundance samples. For 0.1 mg protein input samples, disabling the Φ SDM decreased the median coefficient of variation (CV) from 37% to 22% in control experiments and 45% to 26% in BOOST experiments, while the CV% for 0.3 mg and 1.0 mg samples remained similar between control and BOOST experiments (Figure 3C). Although we observed an increase in CV% for 0.3 mg and 1.0 mg when comparing the control and BOOST experiments without the Φ SDM, the increase in variation did not impact the number of statistically significant pTyr peptide PSMs identified (Figure 3B,C). Together, our data suggest that disabling the Φ SDM for multiplexed TMT experiments with low protein input amounts substantially increases the quality of pTyr quantitation.

The Magnitude of pTyr Quantitation in BOOST Experiments is Improved when Φ SDM is Disabled

Because the goal of BOOST is to improve quantitation of low abundance peptides, we chose to examine the magnitude of improvement with the Φ SDM disabled. We first determined the populations of peptide PSMs unique to BOOST ("BOOST-Gained"), unique to the control ("Control-Only"), or found in both experiments ("Overlap") when the Φ SDM was disabled or enabled (Figure 4A,B, Supporting Tables 1-6). While the percentage of BOOST-Gained peptide PSMs was high without (90.3%) or with (86.6%) the Φ SDM, we identified 1.94-fold more BOOST-Gained peptide PSMs with the Φ SDM disabled than with the Φ SDM enabled (Figure 4A,B). The accuracy of reporter intensity measurements was almost iden-

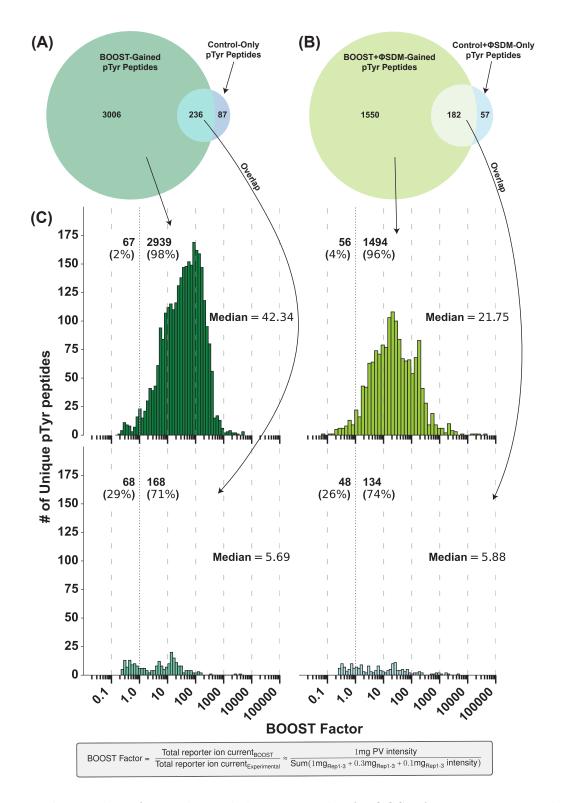


Figure 4: The number of peptides and the magnitude of BOOST factor are increased when the Φ SDM is disabled. (A) Venn diagram showing the number of unique pTyr peptides quantified in the PV carrier channel and observed in at least one experimental channel when the Φ SDM is disabled in the BOOST, the 1.0 mg Control, and in both the BOOST and 1.0 mg Control TMT mixes. (B) Venn diagram showing the number of unique pTyr peptides observed when the Φ SDM is disabled in the BOOST, the 1.0 mg Control, and in both the BOOST and 1.0 mg Control TMT mixes.

tical in overlapping peptides identified in the BOOST and control experiments with the Φ SDM disabled, with a large increase in the number of significant BOOST-Gained peptides in all contrived ratios (Supporting Figure 11). In contrast, the accuracy and yield of significant overlapping peptides were severely lowered in the BOOST experiment compared to the control with the Φ SDM enabled (Supporting Figure 12). When comparing the unique pTyr peptide PSMs observed in the BOOST experiments with or without the Φ SDM, we found that 56.8% (2278) of the unique pTyr peptide PSMs were observed exclusively with the Φ SDM disabled, whereas only 19.2% (768) of pTyr peptide PSMs were observed exclusively with the Φ SDM (Supporting Figure 10A). For the control samples, the majority of the unique pTyr peptide PSMs were observed both with and without the Φ SDM (48.0%) although disabling the Φ SDM led to a modest increase in the percentage of unique pTyr peptides acquired (37.0% versus 15.0%; Supporting Figure 10B). Our data suggest that the Φ SDM degrades the accuracy of measurements in control-overlapping pTyr peptide PSMs and limits the potential to identify unique pTyr peptides.

In our paper describing the BOOST method, we determined the magnitude of quantitative improvement in BOOST experiments using "BOOST factors", defined as the ratio of the reporter intensity from the PV-treated sample to the sum of reporter intensities from experimental channels for a specific peptide PSM (Figure 4C, bottom). ²¹ A peptide PSM with a BOOST factor exceeding 1 occurs when the summed reporter ion current of the PV-treated sample is greater than the reporter ion current of the experimental channels, indicating the peptide is generally scarce in the experimental samples. ²¹ Overall, the majority of BOOST-Gained peptide PSMs had BOOST factors greater than 1 regardless of whether the Φ SDM was enabled or disabled. However, disabling Φ SDM shifted the median BOOST factor value from 21.75 to 42.34 (Figure 4C). The overlapping peptide PSMs had relatively similar BOOST factor distributions with (median = 5.69) or without (median = 5.88) the Φ SDM, suggesting that BOOST-Gained peptide PSMs were lower in abundance with or without the Φ SDM and that disabling the Φ SDM increased acquisition of low abun-

dance peptides. To account for BOOST-Gained pTyr peptide PSMs with missing values, we filtered the data to contain pTyr peptide PSMs where intensity ratios and statistical significance could be attained and plotted their cumulative distributions (Supporting Figure 14). For low abundance ratios (0.3 mg to 0.1 mg, n = 92 and 1.0 mg to 0.1 mg, n = 115) acquired without the Φ SDM, 90% of the significantly changing pTyr peptide PSMs had a BOOST factor less than 5, which shifted to about 18 in the higher abundance ratio (1.0 mg to 0.3 mg). For ratios acquired with the Φ SDM enabled, three pTyr peptide PSMs with BOOST factors less than 1 had statistically significant ratios for 0.3 mg to 0.1 mg and seven pTyr peptide PSMs with BOOST factors less than 5 had statistically significant ratios for 1.0 mg to 0.1 mg (Supporting Figure 14). When we included ratios where at least one replicate value was identified for each protein input sample, the distribution of BOOST factors were almost identical for low abundance samples with 90% of pTyr peptide PSMs having BOOST factors less than 20 (Supporting Figure 14). These data suggest that disabling the Φ SDM increases the quantity and quality of low abundance pTyr peptide PSMs observed using the BOOST method in primary T cells from mice.

BOOST Reveals pTyr Sites Critical for T cell Receptor Signaling in Primary T cells

To show the efficacy of BOOST pTyr proteomics in primary T cells we used α -CD3 antibodies to stimulate TCR signaling (Figure 1). Therefore, we expected to observe many unique pTyr sites on TCR signaling proteins. In accordance with our expectations, we observed a total of 113 unique pTyr sites on proteins in the Kyoto Encyclopedia of Genes and Genomes (KEGG) T cell receptor signaling pathway (Figure 5, Supporting Figure 15). To determine the profiling range of unique pTyr site sequencing in primary T cells using BOOST, we compared our BOOST experiment with the Φ SDM disabled to our previously published BOOST experiment in Jurkat T cells which used an equivalent amount of cellular protein and set of contrived ratios (1.0:0.3:0.1 mg total protein). Our Jurkat BOOST experiment

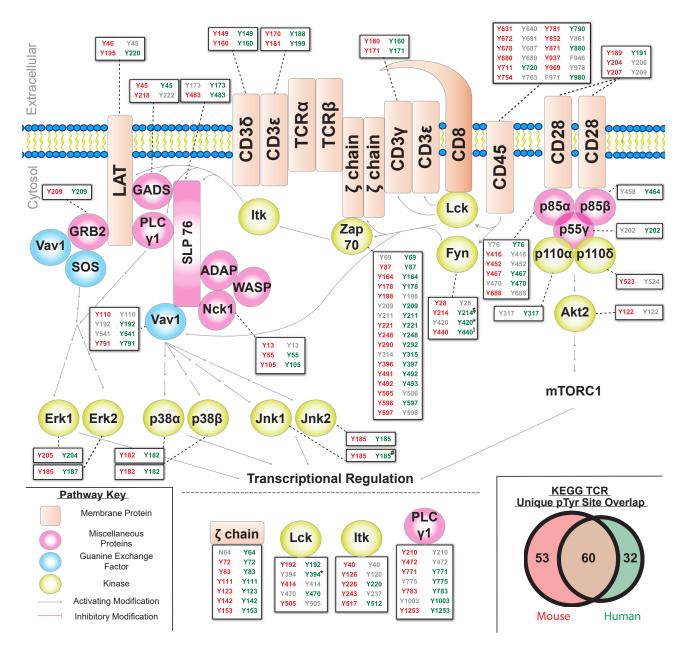


Figure 5: BOOST pTyr proteomics reveals a comparable number of unique TCR-related pTyr sites in primary T cells from mice and Jurkat T cells. Unique pTyr sites identified in our BOOST experiment with the ΦSDM disabled are colored in red. Unique pTyr sites identified by Chua et al. 2020 in the Jurkat T cell model system for studying TCR signaling are colored in green. Inset shows the overlap between unique pTyr sites in the Kyoto Encyclopedia of Genes and Genomes T cell receptor signaling pathway between our BOOST experiment and the BOOST experiment performed by Chua et al. 2020. Special characters next to site numbers indicate the presence of PSMs that arise from multiple proteins: *Fyn/Yes1/Src/Lck | 'Fyn/Yes1/Src | #Jnk1/Jnk3.

was acquired using an Orbitrap Fusion Lumos Tribrid mass spectrometer without the Φ SDM and had a similar BOOST-gained yield to the present primary T cell BOOST data, ^{21,41} and is therefore suitable for comparison. Within the KEGG TCR annotated proteins, we observed 60 pTyr sites in both mouse and Jurkat BOOST experiments (Figure 5 inset, Supporting Figure 15), with the majority of these sites on ITAMs (TCR ζ , CD3 $\delta/\epsilon/\gamma$; 12), the tyrosine kinase Zap70 (10), and the canonical activation sites on mitogen activated protein kinases $(Erk1/2, p38\alpha/\beta, Jnk1/2/3; 7)$. We found 53 unique pTyr sites exclusive to BOOST in primary T cells from mice, compared to 32 unique pTyr sites exclusive to BOOST in Jurkat T cells (Figure 5 inset, Supporting Figure 15). Notably, using the BOOST method in primary T cells from mice uncovered 8 pTyr sites on CD45, a phosphatase critical for the activation of Lck, ⁴² and 4 pTyr sites on Tec, a non receptor tyrosine kinase with overlapping function with Itk in TCR signaling. 43,44 Of the 4 unique pTyr sites observed on Tec, the activation site (Y519) was quantified in all three replicates in the 1.0, 0.3, and 0.1 mg samples of the BOOST experiment, whereas it was quantified in some but not all replicates of all conditions of the 1.0 mg Control experiment. Similar results were found for SHP-1^{Y536}, Itk^{Y512}, Zap70^{Y290}, and Zap 70^{Y492} from our BOOST experiment in primary T cells from mice (Supporting Table 2). These results suggest that using BOOST in primary T cells from mice increases pTyr profiling depth similarly to what we observed previously using Jurkat T cells. ^{21,22}

Discussion

To improve our understanding of the critical tyrosine phosphorylation events involved in TCR signaling and other cellular processes, accurate methods to perform deep profiling of the pTyr proteome are required. Although the accuracy of LC-MS/MS techniques are desirable for pTyr proteomics, the low abundance of tyrosine phosphorylation events in the proteome hinder the frequently used global phosphoenrichment methods like TiO_2 or IMAC. $^{11,12,45-47}$ Although recent developments in pTyr-specific enrichment techniques like

p-Tyr-1000 and the superbinder SH2 method have improved pTyr proteomics, ^{15–21} the issue of low pTyr abundance is apparent when using samples that are difficult or expensive to collect, such as primary cells from humans or mice.^{7,9,10} Increasing quantitative yield in low abundance samples has been acheived in multiplexed TMT experiments using a carrier proteome sample, ^{40,48,49} and we developed the BOOST method using a pervanadate treated sample to increase quantitative yield of pTyr peptides.^{21,22}

Here, we demonstrate the first use of the BOOST method in primary T cells from mice, defining the accuracy, precision, and profiling depth of the mouse T cell pTyr proteome in low abundance samples. Our multiplexed TMT experiments were designed to minimize reporter ion interference from the pervanadate channel by including a "Blank" (127C) channel where maximal reporter ion interference has been observed previously (Supporting Figures 3-6, Figure 2). ^{22,40} Using BOOST, we were able to quantify more than 2,000, 900, and 300 unque pTyr peptides in 1.0 mg, 0.3 mg, and 0.1 mg protein samples, respectively (Figure 2D), while maintaining accuracy and precision (Figure 3, Supporting Figure 4). Using BOOST allowed for 3,006 BOOST-gained pTyr peptides to be quantified with 2,939 pTyr peptides that were low abundance in the samples (Figure 4C). This included 113 unique pTyr sites on proteins involved in the T cell receptor signaling pathway, with 53 of these sites being uniquely identified in mice when compared to our the pTyr sites we originally identified in Jurkat T cells (Figure 5, Supporting Figure 12). ²¹ Of the TCR signaling proteins indentified using BOOST, many of the unique pTyr sites were found in all replicates of the 0.3 and/or 0.1 mg samples in the BOOST experiment and not in the 1.0 mg Control experiment. Together, our data suggest that including a pervanadate BOOST channel increases quantitative depth of low abundance peptides in higher abundance samples and overall quantitation in low abundance samples without large comprimises to accuracy or precision while increasing the number of significant changes observed in the tyrosine phosphoproteome.

We also examined the influence of the acquisition parameter Φ SDM, a computational method that increases acquisition rate of FT-MS by efficient and noise tolerant deconvo-

lution of FT spectra, 30 on our BOOST and 1.0 mg Control samples. Although previous research has shown that using the Φ SDM on long gradients or scarce samples may reduce the efficiency of the algorithm due to low ion currents, 30,41,50 the influence of the Φ SDM on TMT mixes with carrier proteome channels has yet to be evaluated. Our data are in agreement with previous literature suggesting that enabling the Φ SDM degrades low abundance samples. We observed a decrease of about 75 to 100 unique pTyr peptides across our 1.0 mg Control samples with the Φ SDM enabled, with the largest loss in the 0.1 mg R1 sample (221) to 104 unique pTyr peptides; Figure 2A,B). Surprisingly, enabling the Φ SDM degraded the quality of data from BOOST experiments. We observed a large reduction of unique pTyr peptide yield in experimental channels, with the largest difference being 1.0 mg R1 dropping from 2,931 unique pTyr peptides to 784 unique pTyr peptides with the Φ SDM enabled (Figure 2C,D). We also observed a reduction in accuracy (Figure 3B), precision (Figure 3C), and replicate reproducibility (Supporting Figures 4, 5) with the Φ SDM enabled. Our study indicates that disabling the Φ SDM, or "Turbo-TMT" on the method editor on Orbitrap instruments, subtstantially improves the quantitation depth of low abundance posttranslational modification samples, especially when a BOOST channel is present.

With increased interest in using proteomics to study rare or specific posttranslational modifications 20,51,52 and the proteomes of single-cells, 48,49,53 reliable methods to increase multiplexing capabilities, 54 posttranslational modification selection, 55 and quantitation 21,22,56 are desired. These experimental techniques will come with a wave of computational methods to further improve quantitation, 30,57,58 which will require stringent testing for both experimental-computational method compatibility and to understand the range of biological processes that these methods can work with. In this study, we displayed both of these features for the BOOST method by showing that BOOST and the Φ SDM were incompatible and that BOOST can increase the yield of pTyr peptides in primary T cells from mice, which are notoriously refractory for wide scale analysis. By using this study as a benchmark for the BOOST method in primary T cells from mice, future research into the pTyr proteome

of primary T cells from mice is possible using far less sample than is conventionally used.

Conclusion

Our study defines the accuracy, precision, and profiling depth of multiplexed TMT experiments using a pervandate BOOST channel to increase quantitative yield of pTyr peptides in stimulated primary T cells from mice. We found that including the BOOST channel increases the quantitative yield of unique pTyr peptide PSMs without jeoprodizing accuracy, precision, or replicate reproducibility in low abundance samples. Importantly, we found no evidence of reporter ion interference in experimental channels or ratio compression when using BOOST and SPS-MS3 quantitation. The majority of the unique pTyr peptide PSMs observed in the BOOST channel and at least one experimental channel were scarce in the samples, suggesting that BOOST increases identification of rare pTyr peptides. Interestingly, we found that enabling the Φ SDM degrades the quality of data in BOOST experiments, almost halving the unique pTyr peptide PSM yield and reducing accuracy, precision, and replicate reproducibility in low abundance samples. Using BOOST, we were able to quantify many unique pTyr sites on proteins involved in TCR signaling in experimental channels. Together, our study shows that multiplexed TMT experiments using a pervanadate BOOST channel increase quatitative yield of meaningful unique pTyr peptide PSMs in primary T cells from mice and that the Φ SDM should be avoided for BOOST experiments.

Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/. Supporting Information includes:

• All tables generated after MaxQuant analysis of .raw files ("summary.txt", "evidence.txt", "peptides.txt", "modificationSpecificPeptides.txt", "Oxidation (M)Sites.txt", "Phos-

pho (STY)Sites.txt", "proteinGroups.txt", "allPeptides.txt", "msScans.txt", "mzRange.txt", "msmsScans.txt", and "msms.txt") (.ZIP)

- All Python3 code used to perform data analysis and representation, including statistical analyses, replicate reproducibility assessments, BOOST factor analysis, and comparisons between TMT experiments (.ZIP)
- All output from statistical analyses performed and selected MaxQuant output required for statistical analysis (.XLSX)

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Data Availability

The mass spectrometry proteomic data have been deposited to the ProteomeXchange Consortium (http://proteomecentral.proteomexchange.org) via the PRIDE partner repository ⁵⁹ with the dataset identifier PXD025853 (Username: reviewer_pxd025853ebi.ac.uk, Password: RDtiS7iG).

References

(1) Gaud, G.; Lesourne, R.; Love, P. E. Regulatory mechanisms in T cell receptor signalling.

Nature Reviews Immunology 2018, 18, 485–497.

- (2) Palacios, E. H.; Weiss, A. Function of the Src-family kinases, Lck and Fyn, in T-cell development and activation. *Oncogene* **2004**, *23*, 7990–8000.
- (3) Lo, W.-L.; Shah, N. H.; Ahsan, N.; Horkova, V.; Stepanek, O.; Salomon, A. R.; Kuriyan, J.; Weiss, A. Lck promotes Zap70-dependent LAT phosphorylation by bridging Zap70 to LAT. *Nature immunology* 2018, 19, 733–741.
- (4) Kumari, S.; Curado, S.; Mayya, V.; Dustin, M. L. T cell antigen receptor activation and actin cytoskeleton remodeling. *Biochimica Et Biophysica Acta (BBA)-Biomembranes* **2014**, *1838*, 546–556.
- (5) Hunter, T.; Sefton, B. M. Transforming gene product of Rous sarcoma virus phosphorylates tyrosine. *Proceedings of the National Academy of Sciences* **1980**, *77*, 1311–1315.
- (6) Hunter, T. Tyrosine phosphorylation: thirty years and counting. Current opinion in cell biology 2009, 21, 140–146.
- (7) Locard-Paulet, M.; Voisinne, G.; Froment, C.; Goncalves Menoita, M.; Ounoughene, Y.; Girard, L.; Gregoire, C.; Mori, D.; Martinez, M.; Luche, H., et al. LymphoAtlas: a dynamic and integrated phosphoproteomic resource of TCR signaling in primary T cells reveals ITSN 2 as a regulator of effector functions. *Molecular systems biology* 2020, 16, e9524.
- (8) Joshi, R. N.; Binai, N. A.; Marabita, F.; Sui, Z.; Altman, A.; Heck, A. J.; Tegnér, J.; Schmidt, A. Phosphoproteomics reveals regulatory T cell-mediated DEF6 dephosphorylation that affects cytokine expression in human conventional T cells. Frontiers in immunology 2017, 8, 1163.
- (9) Salter, A. I.; Rajan, A.; Kennedy, J. J.; Ivey, R. G.; Shelby, S. A.; Leung, I.; Templeton, M. L.; Muhunthan, V.; Voillet, V.; Sommermeyer, D.; Whiteaker, J. R.; Gottardo, R.; Veatch, S. L.; Paulovich, A. G.; Riddell, S. R. Comparative analysis of TCR

- and CAR signaling informs CAR designs with superior antigen sensitivity and in vivo function. *Science Signaling* **2021**, *14*, eabe2606.
- (10) Ramello, M. C.; Benzaïd, I.; Kuenzi, B. M.; Lienlaf-Moreno, M.; Kandell, W. M.; Santiago, D. N.; Pabón-Saldaña, M.; Darville, L.; Fang, B.; Rix, U.; Yoder, S.; Berglund, A.; Koomen, J. M.; Haura, E. B.; Abate-Daga, D. An immunoproteomic approach to characterize the CAR interactome and signalosome. *Science Signaling* **2019**, *12*, eaap9777.
- (11) Navarro, M. N.; Goebel, J.; Feijoo-Carnero, C.; Morrice, N.; Cantrell, D. A. Phospho-proteomic analysis reveals an intrinsic pathway for the regulation of histone deacetylase 7 that controls the function of cytotoxic T lymphocytes. *Nature immunology* 2011, 12, 352–361.
- (12) Prado, D. S.; Cattley, R. T.; Shipman, C. W.; Happe, C.; Lee, M.; Boggess, W. C.; MacDonald, M. L.; Hawse, W. F. Synergistic and additive interactions between receptor signaling networks drive the regulatory T cell versus T helper 17 cell fate choice. *Journal* of Biological Chemistry 2021, 297.
- (13) Iwai, L. K.; Benoist, C.; Mathis, D.; White, F. M. Quantitative Phosphoproteomic Analysis of T Cell Receptor Signaling in Diabetes Prone and Resistant Mice. *Journal* of Proteome Research 2010, 9, 3135–3145, PMID: 20438120.
- (14) Álvarez-Salamero, C.; Castillo-González, R.; Pastor-Fernández, G.; Mariblanca, I. R.; Pino, J.; Cibrian, D.; Navarro, M. N. IL-23 signaling regulation of pro-inflammatory T-cell migration uncovered by phosphoproteomics. *PLoS biology* 2020, 18, e3000646.
- (15) Kaneko, T.; Huang, H.; Cao, X.; Li, X.; Li, C.; Voss, C.; Sidhu, S. S.; Li, S. S. perbinder SH2 domains act as antagonists of cell signaling. *Science signaling* **2012**, *5*, ra68–ra68.
- (16) Bian, Y.; Li, L.; Dong, M.; Liu, X.; Kaneko, T.; Cheng, K.; Liu, H.; Voss, C.; Cao, X.;

- Wang, Y., et al. Ultra-deep tyrosine phosphoproteomics enabled by a phosphotyrosine superbinder. *Nature chemical biology* **2016**, *12*, 959–966.
- (17) Dong, M.; Bian, Y.; Wang, Y.; Dong, J.; Yao, Y.; Deng, Z.; Qin, H.; Zou, H.; Ye, M. Sensitive, robust, and cost-effective approach for tyrosine Phosphoproteome analysis.

 Analytical chemistry 2017, 89, 9307–9314.
- (18) Tong, J.; Cao, B.; Martyn, G. D.; Krieger, J. R.; Taylor, P.; Yates, B.; Sidhu, S. S.; Li, S. S.; Mao, X.; Moran, M. F. Protein-phosphotyrosine proteome profiling by superbinder-SH2 domain affinity purification mass spectrometry, sSH2-AP-MS. Proteomics 2017, 17, 1600360.
- (19) Yao, Y.; Bian, Y.; Dong, M.; Wang, Y.; Lv, J.; Chen, L.; Wang, H.; Mao, J.; Dong, J.; Ye, M. SH2 Superbinder modified monolithic capillary column for the sensitive analysis of protein tyrosine phosphorylation. *Journal of proteome research* **2018**, *17*, 243–251.
- (20) Yao, Y.; Wang, Y.; Wang, S.; Liu, X.; Liu, Z.; Li, Y.; Fang, Z.; Mao, J.; Zheng, Y.; Ye, M. One-step SH2 superbinder-based approach for sensitive analysis of tyrosine phosphoproteome. *Journal of proteome research* 2019, 18, 1870–1879.
- (21) Chua, X. Y.; Mensah, T.; Aballo, T.; Mackintosh, S. G.; Edmondson, R. D.; Salomon, A. R. Tandem mass tag approach utilizing pervanadate BOOST channels delivers deeper quantitative characterization of the tyrosine phosphoproteome. *Molecular & Cellular Proteomics* 2020, 19, 730–743.
- (22) Chua, X. Y.; Salomon, A. Ovalbumin Antigen-Specific Activation of Human T Cell Receptor Closely Resembles Soluble Antibody Stimulation as Revealed by BOOST Phosphotyrosine Proteomics. *Journal of Proteome Research* 2021, 10.1021/acs.jproteome.1c00239.
- (23) Griffith, A. A.; Callahan, K. P.; King, N. G.; Xiao, Q.; Su, X.; Salomon, A. R. SILAC phosphoproteomics reveals unique signaling circuits in CAR-T cells and the inhibition

- of B cell-activating phosphorylation in target cells. *Journal of proteome research* **2021**, 10.1021/acs.jproteome.1c00735.
- (24) Thompson, A.; Schäfer, J.; Kuhn, K.; Kienle, S.; Schwarz, J.; Schmidt, G.; Neumann, T.; Hamon, C. Tandem mass tags: a novel quantification strategy for comparative analysis of complex protein mixtures by MS/MS. *Analytical chemistry* 2003, 75, 1895–1904.
- (25) Wiese, S.; Reidegeld, K. A.; Meyer, H. E.; Warscheid, B. Protein labeling by iTRAQ: a new tool for quantitative mass spectrometry in proteome research. *Proteomics* 2007, 7, 340–350.
- (26) Werner, T.; Becher, I.; Sweetman, G.; Doce, C.; Savitski, M. M.; Bantscheff, M. Highresolution enabled TMT 8-plexing. *Analytical chemistry* **2012**, *84*, 7188–7194.
- (27) McAlister, G. C.; Huttlin, E. L.; Haas, W.; Ting, L.; Jedrychowski, M. P.; Rogers, J. C.; Kuhn, K.; Pike, I.; Grothe, R. A.; Blethrow, J. D., et al. Increasing the multiplexing capacity of TMTs using reporter ion isotopologues with isobaric masses. *Analytical chemistry* 2012, 84, 7469–7478.
- (28) O'Connell, J. D.; Paulo, J. A.; O'Brien, J. J.; Gygi, S. P. Proteome-wide evaluation of two common protein quantification methods. *Journal of proteome research* **2018**, *17*, 1934–1942.
- (29) Thompson, A.; Wölmer, N.; Koncarevic, S.; Selzer, S.; Böhm, G.; Legner, H.; Schmid, P.; Kienle, S.; Penning, P.; Hoöhle, C., et al. TMTpro: design, synthesis, and initial evaluation of a proline-based isobaric 16-plex tandem mass tag reagent set.

 Analytical chemistry 2019, 91, 15941–15950.
- (30) Grinfeld, D.; Aizikov, K.; Kreutzmann, A.; Damoc, E.; Makarov, A. Phase-constrained spectrum deconvolution for Fourier transform mass spectrometry. *Analytical chemistry* **2017**, *89*, 1202–1211.

- (31) Abraham, R. T.; Weiss, A. Jurkat T cells and development of the T-cell receptor signalling paradigm. *Nature reviews immunology* **2004**, *4*, 301–308.
- (32) Wiśniewski, J. R.; Zougman, A.; Nagaraj, N.; Mann, M. Universal sample preparation method for proteome analysis. *Nature methods* **2009**, *6*, 359–362.
- (33) Ahsan, N.; Salomon, A. R. The Immune Synapse; Springer, 2017; pp 369–382.
- (34) McAlister, G. C.; Nusinow, D. P.; Jedrychowski, M. P.; Wuühr, M.; Huttlin, E. L.; Erickson, B. K.; Rad, R.; Haas, W.; Gygi, S. P. MultiNotch MS3 enables accurate, sensitive, and multiplexed detection of differential expression across cancer cell line proteomes. *Analytical chemistry* 2014, 86, 7150–7158.
- (35) Cox, J.; Mann, M. MaxQuant enables high peptide identification rates, individualized ppb-range mass accuracies and proteome-wide protein quantification. *Nature biotechnology* **2008**, *26*, 1367–1372.
- (36) Cox, J.; Neuhauser, N.; Michalski, A.; Scheltema, R. A.; Olsen, J. V.; Mann, M. Andromeda: a peptide search engine integrated into the MaxQuant environment. *Journal of proteome research* **2011**, *10*, 1794–1805.
- (37) Hornbeck, P. V.; Zhang, B.; Murray, B.; Kornhauser, J. M.; Latham, V.; Skrzypek, E. PhosphoSitePlus, 2014: mutations, PTMs and recalibrations. *Nucleic acids research* **2015**, *43*, D512–D520.
- (38) Benjamini, Y.; Hochberg, Y. Controlling the false discovery rate: a practical and powerful approach to multiple testing. *Journal of the Royal statistical society: series B* (Methodological) **1995**, *57*, 289–300.
- (39) Grus, J. Data Science from Scratch: Sirst Principles with Python; O'Reilly Media, 2019.

- (40) Stopfer, L. E.; Conage-Pough, J. E.; White, F. M. Quantitative consequences of protein carriers in immunopeptidomics and tyrosine phosphorylation MS2 analyses. *Molecular & Cellular Proteomics* **2021**, *20*.
- (41) Yu, Q.; Paulo, J. A.; Naverrete-Perea, J.; McAlister, G. C.; Canterbury, J. D.; Bailey, D. J.; Robitaille, A. M.; Huguet, R.; Zabrouskov, V.; Gygi, S. P., et al. Benchmarking the orbitrap tribrid eclipse for next generation multiplexed proteomics. *Analytical chemistry* **2020**, *92*, 6478–6485.
- (42) Sieh, M.; Bolen, J.; Weiss, A. CD45 specifically modulates binding of Lck to a phosphopeptide encompassing the negative regulatory tyrosine of Lck. *The EMBO journal* 1993, 12, 315–321.
- (43) Yang, W.-C.; Ghiotto, M.; Barbarat, B.; Olive, D. The role of Tec protein-tyrosine kinase in T cell signaling. *Journal of Biological Chemistry* **1999**, *274*, 607–617.
- (44) Aoki, N.; Ueno, S.; Mano, H.; Yamasaki, S.; Shiota, M.; Miyazaki, H.; Yamaguchi-Aoki, Y.; Matsuda, T.; Ullrich, A. Mutual regulation of protein-tyrosine phosphatase 20 and protein-tyrosine kinase Tec activities by tyrosine phosphorylation and dephosphorylation. *Journal of Biological Chemistry* **2004**, *279*, 10765–10775.
- (45) Thingholm, T. E.; Jørgensen, T. J.; Jensen, O. N.; Larsen, M. R. Highly selective enrichment of phosphorylated peptides using titanium dioxide. *Nature protocols* 2006, 1, 1929–1935.
- (46) Thingholm, T. E.; Larsen, M. R. Phospho-Proteomics; Springer, 2016; pp 135–146.
- (47) Thingholm, T. E.; Larsen, M. R. Phospho-Proteomics; Springer, 2016; pp 123–133.
- (48) Petelski, A. A.; Emmott, E.; Leduc, A.; Huffman, R. G.; Specht, H.; Perlman, D. H.; Slavov, N. Multiplexed single-cell proteomics using SCoPE2. Nature protocols 2021, 16, 5398–5425.

- (49) Cheung, T. K.; Lee, C.-Y.; Bayer, F. P.; McCoy, A.; Kuster, B.; Rose, C. M. Defining the carrier proteome limit for single-cell proteomics. *Nature Methods* **2021**, *18*, 76–83.
- (50) Kelstrup, C. D.; Aizikov, K.; Batth, T. S.; Kreutzman, A.; Grinfeld, D.; Lange, O.; Mourad, D.; Makarov, A. A.; Olsen, J. V. Limits for resolving isobaric tandem mass tag reporter ions using phase-constrained spectrum deconvolution. *Journal of proteome* research 2018, 17, 4008–4016.
- (51) Millan-Ariño, L.; Yuan, Z.-F.; Oomen, M. E.; Brandenburg, S.; Chernobrovkin, A.; Salignon, J.; Körner, L.; Zubarev, R. A.; Garcia, B. A.; Riedel, C. G. Histone Purification Combined with High-Resolution Mass Spectrometry to Examine Histone Post-Translational Modifications and Histone Variants in Caenorhabditis elegans. *Current Protocols in Protein Science* **2020**, *102*, e114.
- (52) Fulzele, A.; Bennett, E. J. *The Ubiquitin Proteasome System*; Springer, 2018; pp 363–384.
- (53) Vistain, L. F.; Tay, S. Single-cell proteomics. *Trends in Biochemical Sciences* **2021**, *46*, 661–672.
- (54) Arul, A. B.; Robinson, R. A. Sample multiplexing strategies in quantitative proteomics.

 Analytical chemistry 2018, 91, 178–189.
- (55) Pieroni, L.; Iavarone, F.; Olianas, A.; Greco, V.; Desiderio, C.; Martelli, C.; Manconi, B.; Sanna, M. T.; Messana, I.; Castagnola, M., et al. Enrichments of post-translational modifications in proteomic studies. *Journal of separation science* 2020, 43, 313–336.
- (56) Pino, L. K.; Just, S. C.; MacCoss, M. J.; Searle, B. C. Acquiring and analyzing data independent acquisition proteomics experiments without spectrum libraries. *Molecular & Cellular Proteomics* 2020, 19, 1088–1103.

- (57) Sinitcyn, P.; Hamzeiy, H.; Salinas Soto, F.; Itzhak, D.; McCarthy, F.; Wichmann, C.; Steger, M.; Ohmayer, U.; Distler, U.; Kaspar-Schoenefeld, S., et al. MaxDIA enables library-based and library-free data-independent acquisition proteomics. *Nature biotechnology* 2021, 39, 1563–1573.
- (58) Bilbao, A.; Gibbons, B. C.; Slysz, G. W.; Crowell, K. L.; Monroe, M. E.; Ibrahim, Y. M.; Smith, R. D.; Payne, S. H.; Baker, E. S. An algorithm to correct saturated mass spectrometry ion abundances for enhanced quantitation and mass accuracy in omic studies. *International journal of mass spectrometry* 2018, 427, 91–99.
- (59) Vizcaíno, J. A.; Côté, R. G.; Csordas, A.; Dianes, J. A.; Fabregat, A.; Foster, J. M.; Griss, J.; Alpi, E.; Birim, M.; Contell, J., et al. The PRoteomics IDEntifications (PRIDE) database and associated tools: status in 2013. Nucleic acids research 2012, 41, D1063–D1069.

TOC Graphic

