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In-Depth Mass Spectrometry-Based Proteomics of Formalin-Fixed, Paraffin-Embedded Tissues with a Spatial Resolution of 50–200 *μ***m**

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Supporting Information

AutoPOTS sample preparation workflow using the Opentrons OT-2 (Figure S1); representative Pearson correlation plots for replicate analyses of 200 μ m \times 200 μ m sections of FFPE and frozen tissues (Figure S2); gene ontology plots with respect to cellular component, molecular function, and biological process for proteins identified in frozen and FFPE tissues (Figure S3); GRAVY score showing the relative hydrophobicity of unique peptides from 200 μ m tissue squares (Figure S4); and proteome coverage achieved for 50, 100, and 200 μm fresh-frozen and FFPE tissue squares (Table S1) [\(PDF](https://pubs.acs.org/doi/suppl/10.1021/acs.jproteome.2c00409/suppl_file/pr2c00409_si_001.pdf))

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Abstract

Formalin-fixed, paraffin-embedded (FFPE) tissues are banked in large repositories to costeffectively preserve valuable specimens for later study. With the rapid growth of spatial proteomics, FFPE tissues can serve as a more accessible alternative to more commonly used frozen tissues. However, extracting proteins from FFPE tissues is challenging due to cross-links formed between proteins and formaldehyde. Here, we have adapted the nanoPOTS sample processing workflow, which was previously applied to single cells and fresh-frozen tissues, to profile protein expression from FFPE tissues. Following the optimization of extraction solvents, times, and temperatures, we identified an average of 1312 and 3184 high-confidence master proteins from 10 μm thick FFPE-preserved mouse liver tissue squares having lateral dimensions of 50 and 200 μm, respectively. The observed proteome coverage for FFPE tissues was on average 88% of that achieved for similar fresh-frozen tissues. We also characterized the performance of our fully automated sample preparation and analysis workflow, termed autoPOTS, for FFPE spatial proteomics. This modified nanodroplet processing in one pot for trace samples (nanoPOTS) and fully automated processing in one pot for trace sample (autoPOTS) workflows provides the greatest coverage reported to date for high-resolution spatial proteomics applied to FFPE tissues. Data are available via ProteomeXchange with identifier PXD029729.

Graphical Abstract

Keywords

spatial proteomics; mass spectrometry; FFPE; nanodroplet; autoPOTS; LCM

INTRODUCTION

Biological tissues exhibit phenotypic heterogeneity and plasticity arising from differences in cell type, developmental stage, microenvironment, and stochastic biochemical expression.¹ The need to better understand the spatial organization and heterogeneity of protein expression during tissue development and disease progression is critical for developing new therapies and gaining a deeper understanding of biological systems.² While a small number of proteins may be studied with (sub)cellular resolution using, e.g., immunohistochemistry, 3 imaging mass cytometry, 4 and matrix-assisted laser desorption/ ionization (MALDI) imaging, 5.6 insufficient measurement sensitivity has limited the application of mass spectrometry (MS) to the global profiling of protein expression with high spatial resolution and depth of coverage.

To fill this gap, laser capture microdissection (LCM) has been combined with MS-based proteomics to spatially profile protein expression in tissues. While initial couplings analyzed relatively large tissue amounts comprising many thousands of cells, $7-9$ sample input requirements have decreased dramatically in recent years due to advances in efficient sample processing and increasingly sensitive liquid chromatography (LC)-MS. For example, Xu et al. coupled LCM to a spin-tip-based sample processing workflow termed SISPROT, 10 which contained strong cation-exchange beads and a C18 disk within a spin-tip. Protein extraction, reduction, alkylation, and digestion were carried out within the tip, and the authors identified \sim 500 proteins from 0.1 mm² tissue samples. Davis et al. implemented a series of sample preparation optimizations with respect to sample collection, selection of extraction buffers, and digestion conditions. Using the single-pot, solid-phase-enhanced (SP3) sample processing method, approximately 1500 proteins were identified from 10 μ m thick brain tissue sections with a 0.06 mm² area.¹¹ Our group has also focused on improving the sensitivity of MS-based proteomics for low-input samples including single cells^{12–16} and trace tissue samples^{17–23} through improvements in sample preparation, separations,

ionization, and mass spectrometry. To minimize losses during sample preparation, we developed nanodroplet processing in one pot for trace samples (nanoPOTS), 17 which miniaturizes processing volumes to the nanoliter scale to minimize surface exposure and transfer losses while enhancing reaction kinetics. We also developed the automated transfer of laser-microdissected samples from histology slides to nanowells¹⁹ and have analyzed trace tissues from a variety of biological systems.^{17–23} For example, we quantified protein expression across mouse uterine tissues, achieving a depth of coverage of >2000 protein groups at a 100 μ m spatial resolution.²² This was a first-of-its-kind example of in-depth, high-resolution proteome tissue mapping. Additionally, with the added sensitivity of field asymmetric ion mobility spectrometry (FAIMS), we quantified >1000 protein groups from individual motor neurons and interneurons excised by LCM from human spinal tissues.¹⁵

In the single-cell and near-single-cell proteomic analyses of laser-microdissected tissues described above, the samples were obtained from fresh-frozen specimens. Fresh tissue preservation by flash freezing can be considered a gold standard for biomarker discovery and omics profiling due to its ability to maintain biomolecules in their native state. However, because frozen tissues degrade quickly at room temperature, and due to the high cost of storage at required low temperatures, there is a limited collection of freshfrozen samples available for research purposes.²⁴ Alternatively, tissues may be fixed in formalin and embedded in paraffin wax for long-term preservation.25 These formalin-fixed, paraffin-embedded (FFPE) tissues preserve the morphological and structural properties of proteins and can be stored for decades at room temperature.26 Because of the routine FFPE preservation of tissues in clinical settings and the low cost of room-temperature storage, there are many large repositories of FFPE tissues with associated clinical data for patients, including histology reports, treatments, and responses to treatment. However, while the extensive formaldehyde-mediated cross-links that form between proteins, DNA, and RNA contribute to the long-term preservation of these tissues, they also impact the ability to retrieve biomolecules for further study.²⁷ Despite these challenges, in-depth proteomic analyses using microdissected FFPE tissues have been demonstrated. In 2011, Wi niewski et al. used filter-aided sample preparation (FASP) and LC fractionation to identify up to 4400 proteins from FFPE tissues containing \approx 20,000 cells.²⁸ Further decreases in sample size were reported by Longuespée et al., who developed an improved sample preparation workflow to identify ~1400 proteins from ~0.4 mm² tissue areas containing ~2700 cells.²⁹ This approach enabled FFPE tissues to be used in various studies for the discovery of potential biomarkers and classification of tumors.^{30,31} Griesser and colleagues profiled $1-3$ mm² sections of human substantia nigra tissues to achieve a depth of proteome coverage of 5600 proteins using SP3 sample preparation combined with an isobaric labeling workflow.³² MALDI-based small-molecule imaging has recently guided the selection of tissue regions of interest for microdissection and proteome profiling.33,34 While FFPE tissue regions as small as 0.1 mm² were analyzed, proteome coverage was limited to \sim 200 protein groups at that size scale.³³ To render FFPE tissues suitable for high-spatial-resolution proteome profiling approaching the single-cell level, methods for efficient protein extraction are needed.

Here, we have applied the nanoPOTS sample processing workflow and ultrasensitive LC-MS/MS analysis to in-depth proteome profiling of 10 μm thick FFPE tissues as small as 50 μ m \times 50 μ m. Following a comparison of various extraction solvents, times, and

temperatures, and under the most favorable conditions, we respectively identified an average of 1312 and 3184 high-confidence master proteins from 0.0025 mm² (50 μ m × 50 μ m) and 0.04 mm² (200 μ m × 200 μ m) FFPE-preserved mouse liver tissue sections. This was on average 88% of the proteome coverage achieved for frozen tissues across three different tissue sizes. We also utilized our fully automated auto $POTS³⁵$ sample preparation and analysis workflow using only commercial instrumentation and observed only a modest reduction in proteome coverage for various tissue sizes relative to nanoPOTS (Figure 1). This work significantly extends spatial proteomics of FFPE tissues toward the single-cell level.

MATERIALS AND METHODS

Materials

Dithiothreitol (DTT), iodoacetamide (IAA), formic acid (LC-MS grade), Na₂HPO₄, and NaH2PO4 were purchased from Thermo Fisher Scientific (Waltham, MA). Ammonium bicarbonate (ABC) buffer (50 mM) was freshly prepared from a 500 mM stock solution. LC-MS grade water and acetonitrile were purchased from Honeywell (Charlotte, NC). Trypsin gold and rLys-C (MS grade) were from Promega (Madison, WI). Scott's tap water substitute bluing reagent was from Ricca Chemical (Arlington, TX). Ethanol was purchased from Decon Laboratories, King of Prussia, PA, and paraffin wax was from Blended Waxes, Inc. (Oshkosh, WI). Other chemicals were from Sigma-Aldrich (St. Louis, MO). Neutral buffered formalin (pH 6.8–7.0) was prepared by combining 25 mL (37–40% w/w) of formaldehyde with 225 mL of purified water, 1.0 g of NaH₂PO₄, and 1.625 g of anhydrous Na2HPO4. Carboxymethylcellulose solution (CMC; 2.5% w/v in water) was prepared for embedding fresh samples prior to freezing. A stock solution of n-dodecyl-β-^D-maltoside (DDM, Sigma-Aldrich), a nonionic surfactant used for protein extraction and solubilization,³⁶ was prepared at 1% (w/v) in water and further diluted for use, as described below. Nanowell chips were fabricated as described previously.¹⁷

Tissue Preparation

All protocols involving animal subjects were approved by the Institutional Animal Care and Use Committee of Brigham Young University. A C57BL6 mouse, purchased from Jackson Laboratory (Bar Harbor, Maine), was housed and fed under standard protocols in the BYU Life Sciences Vivarium. The mouse was anesthetized with carbon dioxide and euthanized by cardiac puncture. The liver was rapidly removed and bisected into two halves in a sagittal plane to produce two mirror images. One half was placed on dry ice and then immersed in a 2.5% carboxymethylcellulose (CMC) embedding solution for 1 min at 4 °C prior to freezing at −80 °C for storage. CMC serves as an MS-compatible substitute for the more commonly used optimal cutting temperature (OCT) embedding compound. The other half of the mouse liver was immersed in a 10% neutral buffered formalin solution for 48 h. To dehydrate and paraffin-embed the fixed liver tissue, it was first immersed in 70% ethanol for 1 h, 80% ethanol twice for 30 min, 100% ethanol twice for 30 min, xylene twice for 1 h, and melted paraffin wax at 55 °C twice for 90 min. The FFPE-preserved liver sample was then stored at room temperature until further use. A cryostat (TN50, Tanner Scientific, Sarasota, FL) was set to −13 °C and used to section the fresh-frozen tissue to a thickness of

10 μ m. The tissue sections were deposited onto poly(ethylene naphthalate) (PEN) membrane slides (Carl Zeiss Microscopy, Oberkochen, Germany) and stored at −80 °C. A tabletop microtome was used to cut FFPE tissues to the same $10 \mu m$ thickness; these were placed on PEN membrane slides and stored at room temperature. Tissue sections of both types were stained using hematoxylin and eosin. Briefly, fresh-frozen tissues were fixed in ice-cold 70% ethanol for 30 s, rehydrated with deionized water for 30 s, and stained in Mayer's hematoxylin solution (10% v/v in water) for 10 s. Excess stain was rinsed with water, and the slides were immersed in a bluing solution for 10 s. The tissues were then dehydrated using 70% ethanol for 15 s followed by dipping in eosin (20% v/v in ethanol) for 5 s. Further dehydration was accomplished by dipping in 95% ethanol twice for 30 s followed by 100% ethanol twice for 30 s. The FFPE tissue sections were dewaxed by immersing in xylene twice for 1 min followed by rehydration in 100% ethanol for 15 s, 95% ethanol for 15 s, 70% ethanol for 15 s, and deionized water for 10 s. Once rehydrated, the tissues were stained in hematoxylin for 5 s, rinsed in deionized water for 10 s, and dehydrated in 70% ethanol for 10 s. The tissue sections were counterstained with a quick dip in eosin followed by dehydration in 95% ethanol for 15 s, 100% ethanol for 15 s, and xylene for 10 s. After processing and staining the fresh-frozen and FFPE sections, they were dried in a vacuum desiccator for 10 min.

Laser Microdissection

A glass nanowell chip was thoroughly cleaned, air-dried, and prefilled with 80 nL of dimethylsulfoxide (DMSO) using the nanoPOTS nanoliter liquid handling system and placed in a freezer at −20 °C to reduce evaporation. A PALM MicroBeam LCM system (Carl Zeiss) was used for microdissection of small regions of interest from tissue sections, as described previously.19 The nanowell chip was fixed on a microscope slide adapter (Slide Collector 48, Carl Zeiss) and mounted on the robotic arm of the LCM system. To excise square regions of interest having edge lengths of either 100 or 200 μ m, both fresh and FFPE mouse liver samples were marked and cut using a $10\times$ objective, an energy of 52, and a focus of 91. For 50 μm square tissue regions, a cutting energy of 48 and a focus of 76 were used with a $20\times$ objective. The cut tissues were then catapulted into DMSO-containing nanowells with a laser-pressure catapulting (LPC) energy of 18 and a focus of 15. Following the transfer of the tissue samples to the nanoPOTS chips, they were then stored at −20 °C for up to a week until being further processed.

Sample Preparation

For frozen tissues, following LCM and tissue transfer to the DMSO-containing nanowells, our previously developed protocol was followed.17 Briefly, 100 nL of protein extraction buffer (containing 0.1% DDM and 5 mM DTT in 50 mM ABC) was dispensed into each nanowell and incubated at 70 °C for 1 h. The nanowells were again allowed to air-dry, after which proteins were alkylated with 150 nL of 30 mM IAA for 30 min in the dark. A two-step digestion was carried out at 37 °C with 50 nL of Lys-C (0.1 ng/nL) and 50 nL of trypsin (0.2 ng/nL) for 3 and 10 h, respectively. The digestion was quenched with the addition of 50 nL of 0.1% trifluoroacetic acid (TFA), and peptide solution was collected into a capillary tube (4 cm long, 200 μ m id). The capillary was then sealed with parafilm M at both ends and stored at −20 °C until LC-MS/MS analysis.

For FFPE tissues, the same procedure was followed but with variations in the protein extraction step evaluated for improved proteome coverage, as described in the Results and Discussion section. These included incubating with the same extraction buffer but varying the extraction time from 60 to 180 min and the temperature from 60 to 90 °C. In addition, an alternate extraction buffer consisting of 50% trifluoroethanol (TFE) in 50 mM ABC buffer and 5 mM DTT was evaluated, which was incubated at 90 °C for 90 min. AutoPOTS sample preparation was performed using an Opentrons OT-2 liquid handler (Brooklyn, NY) following a previously reported protocol.³⁵ Specific parameters for all liquid handling steps are shown in Figure S1.

NanoLC-MS/MS Analysis

For nanoPOTS-prepared samples, nanoLC-MS/MS analysis was performed manually, as described previously.¹⁷ The solid-phase extraction (SPE or trapping) column (100 μ m i.d., 5 cm long) and analytical column (30 μ m i.d., 50 cm long) were packed in-house with Dr. Maisch 120 Å C18-AQ 3 μm particles. AutoPOTS-prepared samples were analyzed using an Ultimate 3000 TPL autosampler (Thermo) modified with a 10-port valve.³⁵ The dimensions and media used for the SPE and analytical columns matched those used to analyze the nanoPOTS-prepared samples. For peptide separation, the percentage of mobile phase B (MP B, 0.1% FA in acetonitrile) was increased from 2 to 8% for 3 min, followed by a 100 min linear gradient from 8 to 25% MP B and a 20 min gradient from 25 to 45% MP B. The column was then washed to elute DDM and other hydrophobic species with a linear gradient from 45 to 90% MP B for 20 min followed by a decrease to 2% MP B for 2 min and an increase to 90% MP B for another 5 min. The column was then re-equilibrated for 30 min with 2% mobile phase B. Mass spectra were acquired on a Thermo Orbitrap Exploris 480 mass spectrometer equipped with a nanospray flex source. The electrospray voltage on the 10 μ m i.d. chemically etched nanospray emitter (Micromics Technologies, Spanish Fork, UT) was set to 2.2 kV, and the temperature of the ion transfer tube was 200 °C. For MS1 acquisition, the orbitrap resolution was set to 120,000 full width at half-maximum (FWHM) at m/z 200 with a normalized automatic gain control (AGC) target of 100% (1E6). The maximum injection time was set to 100 ms. For tissue squares having edge lengths of 200 and 100 μ m, the precursor intensity threshold for tandem mass spectrometry (MS2) fragmentation was set to 8000 and the selected charge states were $+2$ to $+7$. The dynamic exclusion duration was set to 30 s, and the time between master scans was 1.5 s. The MS2 Orbitrap resolution was set to 30,000, the maximum injection time was set to 54 ms, and the normalized collision energy was 30% . For 50 μ m tissue squares, the dynamic exclusion duration was increased to 60 s, the time between master scans was 3 s, and the orbitrap resolution for MS2 was increased to $120,000$ (m/z 200) with a maximum injection time of 500 ms, while other parameters remained the same. For the LC-MS/MS analysis of autoPOTS-prepared samples, the separation conditions were the same as for the manual analysis of nanoPOTS-prepared samples but were fully automated, as described previously.³⁵

Data Analysis

Raw files were processed using Proteome Discoverer Software 2.5 (Thermo). The mouse proteome database was downloaded from UniProtKB on June 6th, 2019. A two-step

database search was performed using Sequest HT and INFERYS. The MS/MS spectra were searched for fully tryptic peptides with N-terminal protein acetylation, methionine oxidation, and N-terminal methionine loss acetylation set as variable modifications and carbamidomethylation of cysteine residues as a fixed modification. The precursor and fragment mass tolerances were set to 5 ppm and 0.02 Da, respectively. The match between runs (MBR) feature detection (referred to as Feature Mapping in the software) matched features having a normalized retention time shift of up to 0.7 min and a mass tolerance of 5 ppm. The precursor ion quantifier node was used to calculate protein abundances based on the top three distinct peptides from each protein. The peptides and proteins were filtered with a maximum false discovery rate (FDR) of 0.01. To compare frozen and FFPE samples, global scaling normalization was achieved using scaling coefficients calculated as the ratio of protein abundance to the median protein abundance measured for each grouping (FFPE and frozen). Both unique and razor peptides were selected for protein quantification. Other unmentioned parameters were used as default.

Protein accession numbers of the filtered proteins for both fresh-frozen and FFPE tissues having at least one unique peptide were compiled into a list. The list was then loaded into the jvenn software³⁷ and plotted using the VennDiagramPlotter [\(https://omics.pnl.gov/](https://omics.pnl.gov/software/venn-diagram-plotter) [software/venn-diagram-plotter\)](https://omics.pnl.gov/software/venn-diagram-plotter). Pearson correlations were generated as follows. Highconfidence master proteins for both fresh-frozen and FFPE samples having at least two unique peptides were loaded into Perseus (v1.6.5.0).³⁸ Normalized abundances were log10transformed and filtered such that proteins having valid values detected in 70% of a sample group were retained. The median values were determined for each sample type, and Pearson correlations were plotted for the two sample types.

DATA AVAILABILITY

Mass spectrometry data have been deposited to the ProteomeXchange Consortium via the PRIDE partner repository with data set identifier PXD029729.

RESULTS AND DISCUSSION

Effective protein extraction is a critical step in sample preparation for any proteomics analysis, and studies have reported that incubation at an elevated temperature can improve protein extraction for FFPE tissues.39–41 We first compared proteome coverage between 200 μm square frozen and FFPE mouse liver tissue sections using the nanoPOTS workflow in a solvent containing 0.1% DDM with incubation at 70 °C for 60 min. These general conditions have been used extensively for frozen tissues.^{17–20,22,23} As shown in Figure 2 and the first two rows of Table 1 (frozen and FFPE 1), these extraction conditions yielded reductions of 51 and 35% in peptide and proteome coverage (excluding match between run values), respectively, for the FFPE samples relative to frozen tissues, indicating poor suitability of these conditions for FFPE. To improve protein extraction from FFPE tissues, we explored other extraction solvents, temperatures, and incubation times. These conditions, along with the observed proteome coverage, are listed as FFPE 2 – FFPE 4 in Table 1.

FFPE tissue incubation with 0.1% DDM at 90 °C for 90 min (FFPE 4 in Table 1) yielded the highest level of coverage when compared with other extraction conditions (Figure 2 and Table 1). Fresh-frozen tissues were also analyzed using all conditions shown in Table 1, but our standard conditions of extraction in 0.1% DDM at 70 °C for 60 min provided greater proteome coverage for frozen tissues (data not shown). TFE has been reported previously to be an effective solvent for protein extraction.^{11,42,43} In our experiments, the less favorable performance of TFE (FFPE 3 in Table 1) may be due to its higher volatility leading to rapid evaporation in our nanoliter preparation volumes. As such, we utilized extraction with 0.1% DDM at 90 °C for 90 min (FFPE 4 in Table 1) for the subsequent analysis of FFPE tissues, as these conditions provided the highest proteome coverage and were compatible with nanoliter sample processing.

A Pearson correlation plot of protein intensities for fresh-frozen and FFPE tissues is shown in Figure 3. A modest correlation coefficient of 0.77 for proteins identified with at least two unique peptides indicates significant differences in observed intensities for the two methods of tissue storage. For reference, R^2 values of 0.97 and 0.98 were obtained for replicate analyses of fresh frozen and FFPE tissue samples, respectively (Figure S2), indicating that the relatively low correlation between fresh-frozen and FFPE tissues was not due to technical variability but rather to differences in storage methods. A Venn diagram was also plotted between fresh-frozen and FFPE tissues (Figure 3). A total of 3110 and 2677 proteins were identified for fresh-frozen and FFPE tissues, respectively, with 2464 proteins (74%) overlapping between the two storage conditions. Gene ontology analysis as provided by PD 2.5 classified identified proteins according to cellular compartment, molecular function, and biological processes (Figure S3). A close agreement was observed between fresh-frozen and FFPE tissues in all cases, indicating that any biases were not specific to proteins of a given cellular component or process.

We then studied whether any biases were observed against hydrophilic or hydrophobic peptides during the preparation of FFPE tissues using our optimized method. Using GRAVY index scoring of identified peptides based on the average hydrophobicity of constituent amino acids,44 we found little to no reduction in hydrophobic species and that the reduced peptide coverage for the FFPE tissue was reflected in the identification of fewer hydrophilic species (Figure S4). Given that formaldehyde forms cross-links with hydrophilic amino acids,45 this provided preliminary evidence that protein extraction is adequate, but that a significant degree of cross-linking remains following extraction, resulting in the loss of those cross-linked peptides.

With appropriate extraction conditions, the modified nanoPOTS protocol enables reproducible, in-depth proteome profiling of microdissected FFPE tissues. However, this workflow as performed here is semiautomated and requires expertise in manufacturing nanowell chips, skill in using the robotic system for sample preparation, and delicate manual injection of samples for LC-MS analysis. These requirements limit adoption by other laboratories. To address this, our lab recently developed a fully automated sample processing workflow, termed "autoPOTS",35 which uses a low-cost commercial pipetting robot (Opentrons OT-2). This open-source liquid handler prepares samples in low-microliter volumes within 384-well plates for a fully automated workflow and facile interfacing with

commercial autosamplers. Despite a modest reduction in sensitivity relative to nanoPOTS, autoPOTS can reliably quantify proteins in low-input samples including single cells.³⁵ We therefore evaluated the performance of this fully automated workflow for the global profiling of FFPE tissues. We sampled different sizes of tissue sections in the range of 50 μ m \times 50 μ m to 200 μ m \times 200 μ m from both fresh-frozen and FFPE-preserved mouse liver using both nanoPOTS and autoPOTS. As shown in Figure 4 and the corresponding Table S1, nanoPOTS consistently achieved greater coverage for frozen tissues relative to FFPE, and the use of autoPOTS resulted in an average 30% reduction in proteome coverage for FFPE tissues relative to nanoPOTS when MBR identifications were excluded. Importantly, the reduction in coverage for autoPOTS was 42% for 50 μ m tissue squares and only 23% for 200 μm squares, indicating that with the smallest samples, a nanodroplet sample processing workflow is most critical. When employing MBR (feature mapping in PD 2.5), the reduction in coverage for autoPOTS averaged just 19%, indicating that some of the lost peptides provide a sufficient MS1 signal to still be identified. The modest reduction in coverage for autoPOTS relative to nanoPOTS, particularly for larger samples, indicates that it is suitable for many applications involving the low-input profiling of FFPE tissues.

CONCLUSIONS

There is limited availability of fresh-frozen tissues for translational medicine due to costs of storage and changes in morphology over extended periods. FFPE tissues are stored very cost-effectively at room temperature for up to decades, and large repositories exist in many hospitals and research facilities. These specimens are generally banked with extensive metadata and are essential for biomedical research. We have adapted the nanoPOTS workflow to increase proteome coverage for trace amounts of laser-microdissected FFPE tissues. A loss of primarily hydrophilic peptides in FFPE reduced proteome coverage by 10–15% relative to frozen tissues, and these losses were presumably due to remaining cross-links.

In terms of best practices for the proteome profiling of trace FFPE tissues, we recommend extracting protein at 90 °C for 90 min in the presence of the nonionic surfactant DDM (condition 4 in Table 1), which resulted in greater proteome coverage than other tested conditions. As demonstrated in this work, both the more sensitive nanoPOTS workflow and the fully automated autoPOTS workflow are compatible with the processing and analysis of FFPE tissues, and both approaches provide a greater level of proteome coverage than previously been reported for tissues as small as 50 μ m \times 50 μ m \times 10 μ m (corresponding to the protein content of 10 cells having a radius of $\sim 8 \mu m$). As observed from our autoPOTS results, the use of the more sensitive nanoPOTS workflow is best used for a smaller region of interest in the 50 μ m × 50 μ m range for better protein identification, while regions of interest in the 200 μ m × 200 μ m range and above may be analyzed using the autoPOTS sample workflow as a lower cost and less technically demanding alternative with only a modest reduction in proteome coverage.

To apply the platform to study differential protein expression within FFPE-preserved clinical tissues, there are additional considerations that should be addressed during experimental design. For example, the number of replicate measurements within a tissue and across

subjects will depend on a variety of factors that are specific to a given study. Additionally, as with all low-input proteomics, there is a clear tradeoff between the amount of sample analyzed and the achievable proteome coverage. A compromise must therefore be reached between molecular depth and spatial resolution, which will depend on the size scale of features of interest and the relative abundance of proteins of greatest interest. However, the results presented here lead to specific recommendations for designing a spatial proteomics study. That is, using nanoPOTS sample processing or a similar low-volume 1-step preparation method, sample voxels as small as $10 \mu m \times 50 \mu m \times 50 \mu m$ may reasonably be analyzed, provided that proteins of biological interest in the study are among the \sim 1000 most abundant proteins in the sample. The \sim 2500 most abundant proteins may be studied in 10 μ m thick tissue squares of 100 μ m edge length, and 200 μ m squares can reasonably access the ~3000 most abundant proteins. Of course, improvements to lowinput proteomics workflows are ongoing, and further developments in sample preparation, separations, ionization, MS acquisition, and data analysis will enable greater proteome coverage at a higher spatial resolution. Ideally, these measurements will be achieved at a much higher throughput relative to the current state of the art. While the field of MS-based spatial proteomics is in its early stages, this work establishes the capability of profiling FFPE tissues with high spatial resolution and molecular depth.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Figure 1.

Overview depicting the processing and analysis of microdissected FFPE tissues using either the nanoPOTS (blue arrows) or autoPOTS (red arrows) workflows. For autoPOTS, samples are transferred to a 384-well plate, prepared in an automated fashion using the Opentrons OT-2 liquid handler and analyzed by LC-MS using a commercial autosampler. For nanoPOTS, the excised tissue samples are transferred to custom nanowell chips, prepared using an in-house-developed robotic platform and manually injected for LC-MS analysis.

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Figure 2.

Peptide groups (left) and master proteins (right) identified from 200 μ m \times 200 μ m tissue samples. Specific extraction conditions are shown in Figure 1. $N = 4$ for each condition.

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Figure 3.

Comparison between frozen and FFPE mouse liver tissues obtained from the same mouse. (Left) Pearson correlation plot between fresh-frozen and FFPE tissue types. (Right) Venn diagram showing the overlap of high-confidence master proteins between fresh-frozen and FFPE tissues. Only proteins identified in all four replicates, including those identified with MBR, are included.

Figure 4.

Number of identified peptide groups (Left) and high-confidence master proteins (Right) for the nanoPOTS analysis of frozen and FFPE-preserved mouse liver tissue squares having lateral dimensions of $50-200 \mu m$, as well as autoPOTS analysis of the FFPE tissue sections of the same dimensions. The lighter shading in each bar indicates additional identifications made using MBR. Standard deviations for each condition ($N = 4$) are provided in Table S1.

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Table 1.

Protein Extraction Conditions, Peptides, and Proteome Coverages for Both Fresh-Frozen and FFPE Tissue Samples a

 Values show MS/MS acquisition and match between runs (MBRs) in the table. $N = 4$ for each condition.