WILEY

LETTER TO EDITOR

A biobanking turning-point in the use of formalin-fixed, paraffin tumor blocks to unveil kinase signaling in melanoma

Dear Editor,

Malignant melanoma (MM) is one of the most aggressive human solid tumors, and it is associated with the highest mortality of all skin cancers.¹ Aberrant patterns of protein expression and posttranslational modifications (PTMs) have been linked to MM pathogenesis,² which has promoted large-scale proteomics studies. Our study establishes a novel proteomics strategy that provides validity for formalin-fixed and paraffin-embedded (FFPE) tumors as a novel source for phosphoprotein mapping in MM. This constitutes an important future clinical resource for discovering novel biomarkers and refining therapeutic approaches for MM treatment.

Most of the MM proteomic analyses using patient samples to date have been conducted on fresh frozen tumors (FFT). However, FFT specimens are difficult to preserve with a limited number of samples in biobanks compared to FFPE tissues.³ Roughly 500 million FFPE cancer tissues are stored in biobank archives linked to relevant clinical information.⁴ This represents a precious resource for the elucidation of novel molecular mechanisms and new biomarkers for MM, as well as a potential tool for personalized treatment monitoring. So far, a comparison between the proteomics profiles of FFPE tumor blocks and FFT in the context of MM has not been addressed. Only a few studies have focused on FFPE samples to explore the MM proteome, but none of these has evaluated the preservation of PTMs, such as phosphorylation.⁵ This is important since alterations in the phosphorylation status of the tumor are linked to the activation of oncogenic pathways.6

Here, we analyzed tumor samples derived from 11 patients diagnosed with MM. After surgical removal, all

tumors were cut into several pieces (n = 49). For nine patients, tumor pieces were preserved in a paired fashion, two as FFT and one as FFPE. Three tumor layers of FFPE blocks were analyzed. For two of the patients, we only had tissues preserved with one of the methods, FFT or FFPE. In total, six primary tumors (n = 24 samples) and five tumor metastases (n = 25 samples) were analyzed. The histopathological characterization of the samples was performed (Table S1). Critical parameters such as tumor content, percentage of stroma, degree of necrosis, and lymphocyte infiltration were also considered. Samples were subjected to a streamlined proteomics-phosphoproteomics and bioinformatics pipeline⁷ (Figure S1 and Supporting File 1).

Global proteome analysis resulted in the identification and quantitation of 7624 protein groups across all data sets (Figures 1A-1D, Table S2). Figure 1A shows the total number of proteins identified per patient and preservation conditions. FFT versus FFPE analysis displayed comparable proteome coverages, with an overlap of ~99.8% and ~98.3% for protein and peptide identifications, respectively (Figures 1A and 1B). A strong quantitative correlation between the two conditions was also observed (Pearson correlation, r = 0.97) (Figure 1C, Figure S2). The 2D functional annotation enrichment analysis⁸ unveils similar biological pathways between primary tumors and metastases regardless of storage condition (Figure 1D). Primary tumors were enriched in pathways linked to the epidermis development and differentiation, and extracellular matrix organization. In contrast, metastases displayed pathways related to cell proliferation, RNA metabolism and transcription.

A total number of 12,657 phosphopeptides were identified across all datasets (Table S3). Despite the variations, the overlap between the total number of phosphopeptides identified across FFPE and FFT conditions was 88.4% (Figure 2A). The normalized phosphopeptide abundances show a strong correlation (Pearson correlation, r = 0.89) between FFPE and FFT samples (Figure 2B, Figure S2).

Abbreviations: BRAF, serine/threonine-protein kinase B-raf; ERK, extracellular signal-regulated kinase; FFPE, formalin-fixed and paraffin-embedded; FFT, fresh frozen tumors; MEK, mitogen-activated protein kinase; MM, malignant melanoma; MS, mass spectrometry; PTMs, posttranslational modifications

This is an open access article under the terms of the Creative Commons Attribution License, which permits use, distribution and reproduction in any medium, provided the original work is properly cited.

^{© 2021} The Authors. Clinical and Translational Medicine published by John Wiley & Sons Australia, Ltd on behalf of Shanghai Institute of Clinical Bioinformatics

LETTER TO EDITOR

2 of 6



FIGURE 1 Global proteome analysis of FFPE and FFT tumor samples. (A) Bar graphs showing the proteome coverage by patient and condition, and its association with histological parameters. (B) Venn diagram comparing the overlap between FFPE and FFT samples at the level of peptide identifications and showing the total number of peptides identified across all patients in each condition. (C) Scatter plot of the correlation between the median values of the protein intensities of all identifications in FFT and FFPE samples, across all patients (Pearson correlation, r = 0.97). (D) 2-D pathway annotation enrichment analysis performed with the protein fold changes between primary tumor and metastasis. Blue and red colors represent up-and downregulated pathways in primary tumors, respectively, regardless of condition

More importantly, 2D enrichment annotation analysis⁸ of the phosphoproteome captured similar biological signatures between primary and metastatic tumors, independently of the sample preservation method (Figure 2C). Primary tumors were characterized by the enrichment of pathways related to epidermis development and apoptosis. Metastases were enriched in processes linked to mitochondrial metabolism and microtubule transport. Since alterations in protein phosphorylation most likely reflect changes in kinase activity levels, we assess the potential of FFPE samples to explore the MM kinome. An integrative bioinformatics analysis was performed to detect and predict the kinases present in the (phospho) proteome datasets. Figure 3A shows the mapping of roughly 70% of the human kinome.⁹ This represents the first large-scale kinome analysis reported on MM using



3 of 6



FIGURE 2 Phosphoproteome analysis of FFPE and FFT tumor samples. (A) Bar graph representing the phosphopeptide coverage by patient and condition FFPE versus FFT. (B) Pearson correlation analysis between the FFPE and FFT samples based on median values of the normalized phosphopeptide abundances (phosphopeptide intensity/total protein intensity) (r = 0.89). (C) Comparison between FFPE and FFT conditions based on the enrichment analysis of biological pathways (BP) performed with the phosphopeptides fold changes (log2 ratios) between primary tumor and metastasis (primary/metastasis). Blue and red colors represent BP up- and downregulated in primary tumors (respectively), regardless of condition

FFPE samples, supporting the potential of this approach as a tool to discover new pharmaceutical targets.

In the era of precision medicine, evaluating patientspecific molecular profiles of tumors is critical to guide medical decisions, especially to select appropriate pharmacological strategies and to monitor drug resistance. To evaluate the robustness of our analytical pipeline as a tool to monitor patient-specific molecular events in FFPE versus FFT samples, we investigated the phosphorylation status of crucial oncogenic signaling in MM such as the BRAF pathway (Figure 3B). Multiple BRAF phospho-sites were unambiguously pinpointed (S365, S446, S729) as well as phosphorylated ERK1 (Y204, T202) and ERK2 (T185, Y187) (Figure 3B). Notably, we detect an increase in the phosphorylation of ERK2 at Y187 in a patient with the BRAFV600E mutation (St.IV) (patient 2), compared to a patient (St.III/c.) without this genetic alteration (patient 5) (Figure 3C). Y187 is required for full activation of ERK2 signaling, and the increase in ERK activity is a common resistance mechanism to long-term kinase inhibitor therapy.¹⁰ This demonstrates that our approach allows sensitive monitoring of the differential phosphorylation status of cancer-related pathways of MM in FFPE samples (Figure 3D), which could add a new dimension to the tumor



FIGURE 3 (A) Map of human kinome in malignant melanoma. Blue nodes represent kinases identified in the global proteome dataset. Pink nodes symbolize kinases identified in the phosphoproteome analysis. Coral nodes indicate kinases predicted by phospho-site analysis. (B) Analysis of BRAF signaling pathway. Assigned MS/MS spectrum corresponding to the phosphopeptide VADPDHDHTGFLTEy(187)VATR of the ERK2 activation site. (C) Quantification of the phosphosite Y187 in a patient with BRAFV600E positive tumor metastasis compared to a patient with WT-BRAF tumor metastasis for both FFPE and FFT samples. (D) The main cancer signaling pathways mapped by the global proteome and phosphoproteome analysis. The boxes in yellow, orange, green, and blue show proteins experimentally determined. Additionally, the boxes with the yellow circles and "P" display proteins that were found phosphorylated. The grey boxes represent proteins belonging to the indicated biological pathway, but that were not identified in the study

characterization and personalized treatment strategies. Moreover, multiple relevant oncogenic-related pathways were covered as well as their phosphorylation status (Figure 3D, Figure S3).

In conclusion, our results provide solid evidence of the suitability of FFPE tissue for high-quality quantitative proteomics analysis even at the PTM level. Our data encourage the use of FFPE tumor blocks from biobank archives for large-scale clinical phosphoproteomic studies to uncover kinase signaling associated with MM as well as novel therapeutic targets. The ability to quantify a large number of proteins, together with their modification status in a single analysis, is a valuable tool to compile protein profiles to help in the molecular stratification of MM patients. Incorporating proteomics strategies to screen FFPE tumor blocks in routine clinical settings could help to customize personalized treatment for MM patients.

ACKNOWLEDGMENTS

This study was supported by the Swedish Pharmaceutical Society (Early Career Post-Doc Program 020-022), Berta Kamprad Foundation (European Cancer Moonshot Project; BKS17-22 and The Impact of Malignant Melanoma Tumor Heterogeneity on Drug Treatment Effects at Single Cell Level-a Prospective ProteoGenomic & Digital Pathology Study), ThermoFisher Scientific, Global, and Liconic Biobanking, and was supported by grants from the National Research Foundation of Korea, funded by the Korean government (grant numbers: 2015K1A1A2028365 and 2016K2A9A1A03904900) and Brain Korea 21 Plus Project, Republic of Korea, as well as the NIH/NCI International Cancer Proteogenome Consortium. This work was done under the auspices of a Memorandum of Understanding between the European Cancer Moonshot Center in Lund and the US National Cancer Institute's International Cancer Proteogenome Consortium (ICPC). ICPC encourages international cooperation among institutions and nations in proteogenomic cancer research in which proteogenomic datasets are made available to the public. This work was also done in collaboration with the US National Cancer Institute's Clinical Proteomic Tumor Analysis Consortium (CPTAC).

CONFLICT OF INTEREST

The authors declare no conflict of interest.

ETHICS APPROVAL AND CONSENT TO PARTICIPATE

Fresh frozen tumors (FFT) and formalin-fixed paraffinembedded (FFPE) tissues samples were obtained from the Department of Dermatology and Allergology of the University of Szeged, Hungary, under informed consent and a clinical protocol (MEL-PROTEO-001). The protocol follows the current EU regulations for clinical testing.

DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available from the corresponding author upon reasonable request.

> Erika Velasquez¹ Leticia Szadai⁶ Oimin Zhou⁹ Yonghyo Kim² Indira Pla¹ 💿 Aniel Sanchez¹ Roger Appelqvist^{3,8} Henriett Oskolas² Matilda Marko-Varga³ Boram Lee³ Ho Jeong Kwon⁴ D Johan Malm¹ Attila Marcell Szász⁵ Jeovanis Gil² 🝺 Lazaro Hiram Betancourt² 🕩 István Balázs Németh⁶ György Marko-Varga4,7,8

¹ Section for Clinical Chemistry, Department of Translational Medicine, Lund University, Skåne University Hospital Malmö, Malmö, Sweden ² Division of Oncology and Pathology, Department of Clinical Sciences Lund, Lund University, Lund, Sweden ³ Treat4Life AB, Malmö, Sweden ⁴ Chemical Genomics Global Research Lab, Department of Biotechnology, College of Life Science and Biotechnology, Yonsei University. Seoul. Republic of Korea ⁵ Department of Bioinformatics, Semmelweis University, Budapest, Hungary ⁶ Department of Dermatology and Allergology, University of Szeged, Szeged, Hungar ⁷ 1st Department of Surgery, Tokyo Medical University, Tokyo, Japan ⁸ Clinical Protein Science and Imaging, Biomedical Centre, Department of Biomedical Engineering, Lund University, Lund, Sweden ⁹ Department of Plastic and Reconstructive Surgery, Shanghai Ninth People's Hospital, Shanghai Jiao Tong

University School of Medicine, Shanghai, China

Correspondence

István Balázs Németh, Department of Dermatology and Allergology, University of Szeged, Szeged, Hungary. Email: nemeth.istvan.balazs@med.u-szeged.hu György Marko-Varga, Chemical Genomics Global Research Lab, Department of Biotechnology, College of Life Science and Biotechnology, Yonsei University, Seoul, Republic of Korea.

Email: gyorgy.marko-varga@bme.lth.se

ORCID

Erika Velasquez https://orcid.org/0000-0002-2169-3315 *Indira Pla* https://orcid.org/0000-0002-0839-7829 *Ho Jeong Kwon* https://orcid.org/0000-0002-6919-833X *Jeovanis Gil* https://orcid.org/0000-0003-3601-3893 *Lazaro Hiram Betancourt* https://orcid.org/0000-0001-8207-7041

REFERENCES

- 1. Tas F. Metastatic behavior in melanoma: timing, pattern, survival, and influencing factors. *J Oncol*. 2012;2012:647684.
- 2. Gil J, Betancourt LH, Pla I, et al. Clinical protein science in translational medicine targeting malignant melanoma. *Cell Biol Toxicol.* 2019;35(4):293–332.
- 3. Piehowski PD, Petyuk VA, Sontag RL, et al. Residual tissue repositories as a resource for population-based cancer proteomic studies. *Clin Proteomics*. 2018;15(1):1–12.
- 4. Coscia F, Doll S, Bech JM, et al. A streamlined mass spectrometry-based proteomics workflow for large-scale FFPE tissue analysis. *J Pathol.* 2020;251(1):100–112.

- Kuras M, Woldmar N, Kim Y, et al. Proteomic workflows for high-quality quantitative proteome and post-translational modification analysis of clinically relevant samples from formalin-fixed paraffin-embedded archives. *J Proteome Res.* 2021;20(1):1027–1039.
- Drake JM, Graham NA, Stoyanova T, et al. Oncogene-specific activation of tyrosine kinase networks during prostate cancer progression. *Proc Natl Acad Sci U S A*. 2012;109(5):1643–1648.
- Murillo JR, Kuras M, Rezeli M, Milliotis T, Betancourt L, Marko-Varga G. Automated phosphopeptide enrichment from minute quantities of frozen malignant melanoma tissue. *PLoS One*. 2018;13(12):1–15.
- Cox J, Mann M. 1D and 2D annotation enrichment: a statistical method integrating quantitative proteomics with complementary high-throughput data. *BMC Bioinformatics*. 2012;13 Suppl 1(Suppl 16):S12.
- Metz KS, Deoudes EM, Berginski ME, et al. Coral: clear and customizable visualization of human kinome data. *Cell Syst.* 2018;7(3):347–350.e1.
- Gerosa L, Chidley C, Fröhlich F, et al. Receptor-driven ERK pulses reconfigure MAPK signaling and enable persistence of drug-adapted BRAF-mutant melanoma cells. *Cell Syst.* 2020;11(5):478–494.e9.

SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section at the end of the article.