

Spatially resolved cell profiling unveils tumor metabolic states associated with immunotherapy response in NSCLC

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Introduction

- Multiplex imaging offers a high-resolution approach to comprehensively profile the tumor microenvironment (TME), capturing both tissue architecture and functional states.
- As only a subset of non-small cell lung cancer (NSCLC) patients benefit from immune checkpoint inhibitors (ICIs), there is a clinical need to develop predictive biomarkers for ICIs and to deepen our understanding of response and resistance mechanisms.
- In this study, we leveraged multiplex imaging techniques to investigate functional profiles within cell subtypes in both responders and non-responders to immune checkpoint inhibitors (ICIs).

Methods

- We profiled a retrospective cohort of 39 NSCLC tissue cores from 27 patients treated with ICI, using highly multiplexed immunofluorescence (mIF) stained by the Phenocycler Fusion platform (Akoya Biosciences) capturing 45 proteins.
- Utilizing our previously published deep learning-based multiplex imaging analysis pipeline¹ (Figure 1), cells were classified to 15 cell types by known protein expression.
- To identify functional cell subtypes, each cell type was further subclassified by unsupervised clustering of the expression vector of metabolic and cell state proteins.
- Following cell typing, cellular neighborhoods were designated as previously described². Tumor cell-enriched neighborhoods were defined as the tumor area, whereas all other neighborhoods were defined as the TME.
- We compared the distribution of cell types and subtypes within tumor areas between responders and non-responders to ICI therapy using Fisher's exact and logrank tests.

References

- Markovits, E. et al. A novel deep learning pipeline for cell typing and phenotypic marker quantification in multiplex imaging. *bioRxiv* 2022.11.09.515776 (2022).
- Schürch, C. M. et al. Coordinated Cellular Neighborhoods Orchestrate Antitumoral Immunity at the Colorectal Cancer Invasive Front. *Cell* 182, 1341-1359.e19 (2020).

Results

- Unsupervised cell subtyping of the 15 cell types identified 43 cell subsets, which were mostly segregated by their metabolism and activation status (Figure 2).
- In lymphocytes, we found a connection between metabolic state, effector functions and tissue localization as the metabolically active lymphocytes exhibited higher levels of PD-1, MHC class I and II and CD44 positivity, and were more abundant within tumor infiltrating lymphocytes (TILs) and tertiary lymphoid structures (Figure 3).

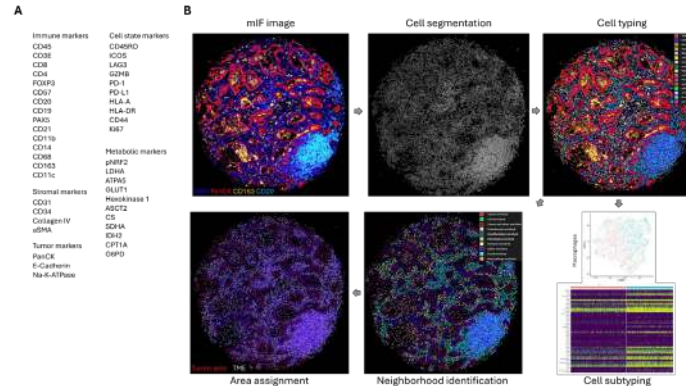


Figure 1: (A) Protein panel used in this study. (B) Image structuring workflow diagram.

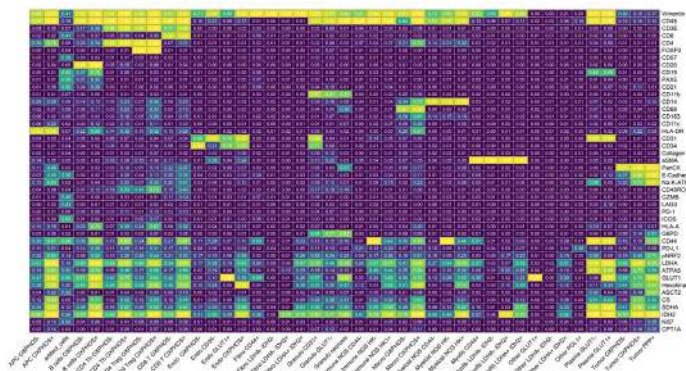


Figure 2: Mean marker positivity within the 43 cell subtypes.

- Tumor cells clustered to three main metabolic states - OXPPOS+, OXPPOS- and a third cluster (PPP+), which was characterized by upregulation of ASCT2, a glutamine transporter, as well as pNRF2 and G6PD, regulators of the pentose phosphate pathway. These cells exhibited higher proliferation rate and upregulation of CD44, a tumor stemness marker (Figure 4A).
- Tumors with high content of PPP+ tumor cells (>40%) were resistant to PD-1 blockade and showed reduced overall survival (OS) rates (Figure 4B).

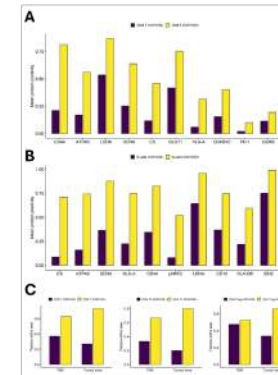


Figure 3: A-B) Differentially expressed proteins between CD8 T-cells (A) and B-cells (B) subtypes. (C) Fraction of cell subtypes by area.

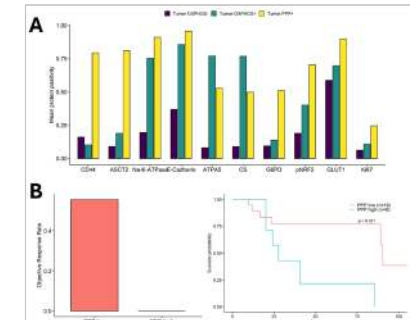


Figure 4: (A) Differentially expressed proteins between tumor cells subtypes. (B) Objective response rate and overall survival between the PPP high and low groups.

Conclusion

- Our novel approach for cell typing and subtyping combining supervised and unsupervised methods has unveiled a nuanced landscape of distinct cell subsets in the tumor microenvironment, primarily categorized by metabolism and activation states.
- This comprehensive profiling of lymphocytes and tumor cells provides critical insights into the interplay between metabolic state, effector functions, and tissue localization, potentially reshaping our understanding of immune response mechanisms.
- The identification of a unique PPP+ metabolic state in tumors, associated with resistance to PD-1 blockade and reduced overall survival, underscores the clinical importance of metabolic profiling in predicting treatment outcomes and patient prognosis.
- These findings not only advance our knowledge of tumor biology but also pave the way for personalized therapeutic strategies targeting specific metabolic pathways to enhance treatment efficacy and patient outcomes.