

## Unlocking Single-Cell Immunometabolism Research: A Call for Accessible Tools

Jason Cosgrove, Antoine Marçais, Felix Hartmann, Andreas Bergthaler, Ivan Zanoni, Mauro Corrado, Leïla Perié, Nina Cabezas-Wallscheid, Philippe Bousso, Theodore Alexandrov, et al.

### ▶ To cite this version:

Jason Cos<br/>grove, Antoine Marçais, Felix Hartmann, Andreas Bergthaler, Ivan Zanoni, et al.<br/>. Unlocking Single-Cell Immunometabolism Research: A Call for Accessible Tools. Nature Metabolism, In press, 10.1038/s42255-024-01031-w<br/>. hal-04579523

## HAL Id: hal-04579523 https://hal.science/hal-04579523

Submitted on 17 May 2024  $\,$ 

**HAL** is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers. L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.



Distributed under a Creative Commons Attribution - NonCommercial - ShareAlike 4.0 International License

### 

# Unlocking Single-Cell Immunometabolism Research: A Call for Accessible Tools

3			
4	lason Co	osgrove <sup>1</sup> Antoine Marcais <sup>2</sup> Felix I. Hartmann <sup>3</sup> Andreas Bergthaler <sup>4</sup> Ivan Zanoni <sup>5</sup> Mauro Corrado <sup>6</sup> Leïla	
5	Periá <sup>1</sup> Nina Cabezas-Wallscheid <sup>7</sup> Philippe Bousso <sup>8</sup> Theodore Alexandrov <sup>9,10</sup> Tammy Kielian <sup>11</sup> Nuria Martínez-		
6	rene ,	Martín <sup>12</sup> Christiane A. Onitz <sup>13</sup> Costas A. Lyssiotis <sup>14</sup> Rafael I. Argüello <sup>15</sup> Jan Van den Bossche <sup>16,*</sup>	
7			
8	1	Institut Curie, Université PSL, Sorbonne Université, CNRS UMR168, Laboratoire Physico, Chimie Curie	
q	1.	75005 Paris France	
10	2	CIPL Centre International de Recherche en Infectiologie (Team Lyacts) Univ Lyon Inserm 11111	
11	۷.	Université Claude Bernard Lyon 1 CNPS LIMP5308 ENS de Lyon E-60007 Lyon France	
12	С	Corman Cancer Research Conter (DKE7) Heidelberg Systems Immunology & Single Coll Biology	
12	Э.	Germany and German Cancer Concortium (DKTK) DKE7, core center Heidelberg, Germany	
1/	Λ	Medical University of Vienna, 1000 Vienna, Austria and CeMM Research Center for Molecular Medicine	
15	ч.	of the Austrian Academy of Sciences 1090 Vienna, Austria	
16	5	Division of Immunology Division of Gastroenterology Boston Children's Hospital Harvard Medical	
17	5.	School. 02115. Boston. USA.	
18	6.	Cologne Excellence Cluster on Cellular Stress Responses in Aging-Associated Diseases (CECAD). Center	
19	•	for Molecular Medicine Cologne (CMMC) and Institute for Genetics. University of Cologne, 50931	
20		Cologne, Germany.	
21	7.	Max Planck Institute of Immunobiology and Epigenetics, Freiburg, Germany	
22	8	Institut Pasteur Université Paris Cité INSERM 11223 Dynamics of Immune Responses Unit Paris	
22	0.	France	
22	9	Structural and Computational Biology Unit European Molecular Biology Laboratory, Heidelberg	
25	5.	Germany	
26	10.	Bio Studio, BioInnovation Institute, Copenhagen, Denmark	
27	11.	Department of Pathology, Microbiology, and Immunology University of Nebraska Medical Center.	
28		Omaha. NE USA	
29	12.	Program of Tissue and Organ Homeostasis, Centro de Biología Molecular "Severo Ochoa," Consejo	
30		Superior de Investigaciones Científicas-Universidad Autónoma de Madrid, Madrid, Spain.	
31	13.	German Cancer Research Center (DKFZ), Heidelberg, Division of Metabolic Crosstalk in Cancer and the	
32		German Cancer Consortium (DKTK), DKFZ Core Center Heidelberg, 69120 Heidelberg, Germany.	
33	14.	Department of Molecular & Integrative Physiology, Department of Internal Medicine, Division of	
34		Gastroenterology and Hepatology, Rogel Cancer Center, University of Michigan, Ann Arbor, MI 4810	
35	15.	Aix-Marseille University, CNRS, INSERM, CIML, Centre d'Immunologie de Marseille-Luminy, Turing	
36		Centre for Living Systems, Marseille, France.	
37	16.	Department of Molecular Cell Biology and Immunology, Amsterdam Cardiovascular Sciences,	
38		Amsterdam Gastroenterology Endocrinology Metabolism, Amsterdam Institute for Infection and	
39		Immunity, Cancer Centre Amsterdam, Amsterdam UMC, Vrije Universiteit Amsterdam, Amsterdam,	
40		the Netherlands. *j.vandenbossche@amsterdamumc.nl	
41			
42			
43			
44			
45			
15			
40			
47			
48			
49			
50			
51			
52			
53			

54 Recent technological advances permit the profiling of metabolic changes in single cells, shedding light 55 on how metabolism regulates immune responses. We advocate that accessible and standardized tools 56 are needed to reduce the barrier of entry to immunometabolism studies and facilitate the translation 57 of fundamental findings towards clinical applications.

58

#### 59 Immunometabolism: from niche to research field

60 Historically considered as a set of passive house-keeping functions required for cell survival, metabolism is now recognized to play an active and multifaceted role in regulating immune cell fate, 61 62 function and disease. However, progress in the field of immunometabolism has been hampered by the 63 low sensitivity of metabolic profiling approaches. The enormous diversity in the structure and 64 biochemical properties of metabolites makes it difficult to detect metabolic changes in rare cell types. 65 This issue is further complicated by compound fragility and limited methods to amplify signal, as is 66 common for nucleic acid-based profiling methodologies, complicating translational research on cells 67 isolated from patient samples, which are often too scarce or too heterogeneous to perform "traditional" metabolic analyses. To address this issue, the immunometabolism field has focused on 68 69 developing high-sensitivity and low-input assays that can profile small amounts of starting material, 70 even with single cell resolution.

71

72 Key developments in recent years include cytometry-based techniques that can quantify enzyme and transporter expression levels (single-cell metabolic profiling [scMEP]<sup>1</sup>; assessing Metabolism by Flow 73 74 cytometry [Met-Flow]<sup>2</sup>), nutrient uptake assays (e.g. QUAS-R)<sup>3</sup> and metabolic pathway capacities and 75 dependencies (Single-cell Profiling and Imaging of Cell Energy Metabolism [SPICE-Met]<sup>4</sup>; Single Cell 76 Energetic metabolism by profiling Translation inhibition [SCENITH<sup>™</sup>]<sup>5</sup>). In parallel, single-cell 77 metabolomics, fluxomics and mass spectrometry imaging (MSI) are rapidly improving in sensitivity and 78 throughput, permitting direct metabolite quantification in rare cell types and tissues<sup>6, 7</sup> down to the 79 single-cell level (SpaceM)<sup>8</sup> (summarized in Supplementary Figure 1, top panel). Furthermore, 80 antibodies against specific metabolites are now available via immusmol and Immundiagnostik AG, 81 allowing for the detection and quantification of metabolites in samples with limited material. As 82 technologies mature, they are being increasingly integrated with multi-omics, imaging and lineage 83 tracing assays – a comprehensive approach that adds spatial and functional context to metabolic 84 measurements across cells, tissues and organisms<sup>9</sup>. Importantly, many of the innovations detailed 85 above have been fueled by an expanding catalogue of reagents including chemical probes and dyes, 86 antibodies, and pharmacological inhibitors as well as by increases in mass spectrometry sensitivity, 87 and by computational methods and software for data integration and interpretation. This 88 development illustrates the importance of an interdisciplinary approach that allocates the collective 89 resources of the industry and public research sectors in an efficient way to advance the field. Dramatic 90 innovations have helped the immunometabolism field to mature and advance our fundamental 91 understanding of immunity and inflammation, yielding a number of promising translational research innovations, from the refinement of cell culture systems to metabolite derivatives that suppress 92 93 immune cell activity<sup>10</sup> and the optimization of cell therapies<sup>11</sup>. To obtain biologically and metabolically 94 meaningful data, a selection of tools should be utilized in a complementary fashion since all 95 immunometabolic profiling approaches have their advantages and disadvantages. For a 96 comprehensive overview of the limitations of current methods, as well as selection guides and other summarizing tables, we refer the reader to recent articles on these subjects<sup>7, 12, 13</sup>. 97

98

Here, we highlight a key challenge in immunometabolism research and provide guidance on how to overcome it to advance the field. One major problem is that immunometabolic approaches typically require significant expertise and resources to establish and implement existing assays, and to analyze and interpret the associated data. Considerable resource investment and repeated trial-and-error processes are thus required to optimize and adapt state of the art immunometabolism approaches to different research contexts. A major challenge will thus be not only to extend, but to simplify, generalize and standardize the existing toolkits, and to encourage companies to develop and offer a range of readily accessible optimized tools and reagents. Over the longer term, these tools will enable the scientific community to perform immunometabolic assays in a more rigorous and reproducible manner, which is critical for translating immunometabolism approaches into clinical practice.

- 109
- 110
- 111 112

The future of single-cell metabolic analyses

Resources needed to advance immunometabolism research

113

The future of single-cell metabolic analyses

114 As outlined above, a series of novel immunometabolic methods use antibodies to quantify metabolic 115 cell states. Currently, most available commercial antibodies directed against enzymes or regulators 116 involved in the control of metabolism are unconjugated and thus requires custom coupling, a step that 117 is time- and resource-consuming, error-prone and adds another source of variability that could limit 118 reproducibility. In addition, some metabolic pathways cannot be easily assessed due to the absence of 119 cytometry-validated antibodies targeting associated enzymes and transporters. We thus advocate for 120 the development of commercially available validated antibodies and calibrated ready-to-use 121 cytometry and imaging panels that would allow the inclusion of antibody-based metabolic profiling 122 approaches in the common toolbox of immunometabolism research. Here, we propose three panels 123 of enzymes that can be used alone or in combination to gather insights into glycolysis, mitochondrial 124 respiration (panel 1 A and B), and other metabolic pathways (panel 2) in single cells using fluorescence-125 or TOF (time-of-flight)-based cytometry and imaging (Table 1).

126

127 New analytical tools and approaches are required to accurately capture the spatiotemporal dynamics 128 of immunometabolic changes. With the emergence of techniques like mass spectrometry imaging, 129 imaging mass cytometry (IMC), multiplexed ion beam imaging (MIBI), and in situ metabolic 130 measurements, researchers can now spatially map the metabolic configuration of immune cells in 131 tissues. Yet, defining the kinetics by which metabolic rewiring occurs remains a challenge. Capturing 132 this temporal aspect of immunometabolism will facilitate the rational design of therapies by separating 133 metabolic drivers of disease and immunity from bystander effects. In general, mass spectrometry and 134 other analytical tools with a higher sensitivity will enable capturing measurements with improved 135 spatial resolution from low input material facilitate the study of rare cell populations with better 136 precision. Moreover, mass spectrometry can also provide extra layers of information about the 137 subcellular distribution and organization of metabolic events.

138

139 Another challenge is the development of alternatives to fluorescently labeled metabolites, such as 2-NBDG, to measure glucose flux. CLICK chemistry-based approaches<sup>3, 14</sup> that have been developed to 140 141 measure metabolism provide one potential solution. However, directly measuring enzymatic activities 142 by flow cytometry would allow for more functional metabolic analyses at single-cell level. Different sensors (e.g. for NAD+/NADH, lactate, etc<sup>15</sup>) to quantify metabolism using imaging and cytometry-143 144 compatible fluorescence readouts are emerging. Incorporating these sensors into commercially 145 available lentiviral backbones and/or mouse models should improve the accessibility of such methods. 146 Other genetic tools that will advance immunometabolism research include functional genomics 147 approaches such as Perturb-seq that can functionally test the importance of metabolic genes in 148 regulating immunity and disease outcome. Finally, there is a need for mass spectrometry approaches 149 for isotope tracing and fluxomics at the single-cell level that would allow the unbiased and quantitative 150 profiling of metabolic activities of glycolysis and other metabolic pathways. New technologies enabling 151 these steps are currently under development (Figure S1, bottom). In addition to developing new tools, 152 both academia and industry should focus on the refinement of existing tools that have been recently 153 developed to reduce technological barriers for researchers entering the field. 154

155

Standardized analysis approaches

157 In parallel with experimental advances, new computational and analytical tools are needed to analyze 158 multi-modal immunometabolism data. Single-cell omics data is characterized by high levels of sparsity 159 (i.e. limited depth of coverage), variability and noise. Furthermore, due to the non-linear relationship 160 between RNA, protein and metabolite levels, it is non-trivial to consolidate data across different omics 161 modalities and to link metabolite levels and RNA/protein expression information to cell function. In 162 addition, different assays measure different aspects of metabolism, for example enzyme expression 163 patterns versus metabolic fluxes. There are no commonly accepted ways to visualize multimodal 164 metabolism data in a single plot. Significant computational biology expertise is therefore needed to 165 consolidate metabolomics measurements across modalities into meaningful insights. Some 166 bioinformatics pipelines to analyze multi-omics data have been developed, for example pairing protein 167 and RNA measurements using the Seurat analysis package, but such tools are not tailored to study 168 metabolic processes.

169

170 Extracellular flux analysis using the Seahorse device helped to open up and grow the immunometabolism field not only by offering new tools, but by providing analysis pipelines to easily 171 172 obtain glycolysis- and respiration-related metabolic parameters. In a similar way, SCENITH<sup>™</sup> allows 173 calculating metabolic dependencies of immune subsets in a user-friendly manner<sup>5</sup>. Hartmann et al. calculate glycolysis and respiration scores by taking the expression of metabolic enzymes in the 174 175 respective pathways into account<sup>1</sup>. Furthermore, SpaceM and other mass spectrometry-based 176 approaches demonstrate the feasibility of direct metabolic profiling<sup>8</sup>. Integrating metabolic analyses 177 and visualizing metabolic perturbations into existing, and potentially also novel, software will help 178 establish immunometabolic profiling as a common research practice. In this context, having user-179 friendly tools to infer metabolic information from scRNA-seq and CRISPR screens will be useful to add 180 an immunometabolic perspective on such data. Currently, most existing analysis pipelines are 181 implemented as programming scripts that are not generalizable and, therefore, cannot analyse 182 different data types depending on the context of research questions. Moreover, public sharing of 183 generated data is crucial to provide reference datasets and help develop software tools. Defining data 184 and metadata standards and consolidating existing analysis approaches into an open-source software 185 package, web portals and applications, such as has been done for single-cell RNA sequencing analysis, 186 is a necessary step to further advance the immunometabolism field.

187 188

189

192

193

196

#### A wish list for immunometabolism research

- To increase accessibility, standardization, interpretation and general use of current tools by a broaderaudience, we here summarize key aspects into a wish list:
  - Standardized ready-to-use antibody panels targeting a common set of metabolic regulators for immunometabolism profiling (proposed in Table 1)
- Validated and conjugated monoclonal antibodies to customize cytometry and histology metabolic panels
  - Readily available SCENITH<sup>™</sup> kit containing standardized components
- New mass spectrometers and commercial mass spectrometry services capable of profiling
   single cells or populations of relatively rare cells (< 10,000 cells)</li>
- Software to analyze and visualize datasets from the distinct immunometabolic profiling approaches
  - Incorporate genetically encoded biosensors for metabolic pathways into vectors and mouse models (e.g. SPICY mice<sup>4</sup>)
- Click chemistry-based approaches enabling to assess nutrient uptake and metabolic
   dependencies of single cells
- 205

201

202

#### 208 Conclusion

209

As the immunometabolism field is rapidly evolving, we must consider how to make technological innovations broadly accessible to bridge the gap between research and clinical practice. With this

commentary, our goal is to advocate for the development and commercialization of versatile,

accessible, and standardized tools allowing the community to take a crucial step forward and unlock

- single-cell immunometabolism research. We urge both researchers and companies to respond to our
- call to collaboratively propel the immunometabolism field forward.
- 216

1. Glycolysis k respiration panelsPathwayA. BasicGLUT1Glucose uptakeglycolysis / fermentationPKMGlycolysis / transcriptional regulatorInternet of the second sec	Table 1. Proposed panels for cytometry and imaging-based single-cell profiling					
A. Basic         GLUT1       Glucose uptake       glycolysis / fermentation         PKM       Glycolysis / transcriptional regulator       glycolysis / fermentation         LDH       Pyruvate to lactate conversion       TCA cycle / mitochondrial respiration         IDH       Isocitrate dehydrogenase       TCA cycle / mitochondrial respiration         ATP5A       ATP synthase / ETC complex V       TCA cycle / mitochondrial respiration         B. Extension       *       state dehydrogenase         MCT1       Extension       glycolytic enzyme / immune regulator         MCT1       Lactate transport       glycolytic oncomplex V         OGDH       alpha-ketaglutarate dehydrogenase       TCA cycle / mitochondrial respiration         SDH       Succinate dehydrogenase / ETC complex II       transport         CytC       Cytochrome C, essential for ETC function       transport         BGPD       G6P dehydrogenase, rate-limiting PPP step       Pentose phosphate pathway         CD98/LATI       Essential amino acid transporter       Amino acid metabolism         ASCT2       Alanine/Serine/Cysteine-preferring amino acid transporter 2       Fatty acid metabolism         GLS6       Glutamine to glutamate conversion       Fatty acid metabolism         CD36/FAT       Fatty acid shuttling into mitochondriai	1. Glycolysis	s & respiration panels	Pathway			
GLUT1Glucose uptakeglycolysis / fermentationPKMGlycolysis / transcriptional regulatorLDHPyruvate to lactate conversionTCA cycle / mitochondrial respirationCSCitrate synthaseTCA cycle / mitochondrial respirationIDHIsocitrate dehydrogenaseATP5AATP synthase / ETC complex VB. Extension*HKFirst glycolytic enzyme / immune regulatorglycolysis / fermentationMCT1Lactate transportOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IICytCCytochrome C, essential for ETC function2. Broad metabolism panel **Sential amino acid transporterGGPDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Amino acid metabolismGLSGlutamine to glutamate conversionFatty acid metabolismCD36/FATFatty acid transporterFatty acid metabolism	A. Basic					
PKMGlycolysis / transcriptional regulatorLDHPyruvate to lactate conversionCSCitrate synthaseIDHIsocitrate dehydrogenaseATP5AATP synthase / ETC complex VB. Extension *HKFirst glycolytic enzyme (mmune regulatorGAPDHGlycolytic enzyme / immune regulatorMCT1Lactate transportOGDHalpha-ketaglutarate dehydrogenaseSDHSuccinate dehydrogenase / ETC complex IICyticCytochrome C, essential for ETC functionDGP8/LAT1Essential amino acid transporterGGPDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2GLSGlutamine to glutamate conversionCD36/FATFatty acid transporterCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	GLUT1	Glucose uptake	glycolysis / fermentation			
LDHPyruvate to lactate conversionTCA cycle / mitochondrial respirationCSCitrate synthaseTCA cycle / mitochondrial respirationIDHIsocitrate dehydrogenaseTCA cycle / mitochondrial respirationATP5AATP synthase / ETC complex VInterpret and the spirationB. Extension *Siglocolytic enzymeglycolysis / fermentationGAPDHGlycolytic enzyme / immune regulatorglycolysis / fermentationMCT1Lactate transportTCA cycle / mitochondrial respirationOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IICytlcCytlcCytochrome C, essential for ETC functionPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid metabolismGLSGlutamine to glutamate conversionFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	PKM	Glycolysis / transcriptional regulator				
CSCitrate synthaseTCA cycle / mitochondrial respirationIDHIsocitrate dehydrogenaseATP5AATP synthase / ETC complex VB. Extension*HKFirst glycolytic enzyme / immune regulatorglycolysis / fermentationGAPDHGlycolytic enzyme / immune regulatorMCT1Lactate transportOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IICytCCytochrome C, essential for ETC function2. Broad metzbolism panel **G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LATIEssential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid transporterGLSGlutamine to glutamate conversionFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	LDH	Pyruvate to lactate conversion				
IDHIsocitrate dehydrogenaseATP 5AATP synthase / ETC complex VB. Extension*HKFirst glycolytic enzymeglycolysis / fermentationGAPDHGlycolytic enzyme / immune regulatorglycolysis / fermentationMCT1Lactate transportTCA cycle / mitochondrial respirationOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IITCA cycle / mitochondrial respirationCytCCytochrome C, essential for ETC functionPentose phosphate pathwayCogB/LATIEssential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid shuttling into mitochondriaCD36/FATFatty acid shuttling into mitochondriaFatty acid metabolism	CS	Citrate synthase	TCA cycle / mitochondrial respiration			
ATP 5AATP synthase / ETC complex VImage: Complex VB. Extension *HKFirst glycolytic enzyme / immune regulatorglycolysis / fermentationGAPDHGlycolytic enzyme / immune regulatorglycolysis / fermentationMCT1Lactate transportTCA cycle / mitochondrial respirationOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IITCA cycle / mitochondrial respirationCytCCytochrome C, essential for ETC functionTCA cycle / mitochondrial respirationCytD8/LATIEssential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid metabolismCD36/FATFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	IDH	Isocitrate dehydrogenase				
B. Extension *         HK       First glycolytic enzyme       glycolysis / fermentation         GAPDH       Glycolytic enzyme / immune regulator       glycolysis / fermentation         MCT1       Lactate transport       TCA cycle / mitochondrial respiration         OGDH       alpha-ketaglutarate dehydrogenase       TCA cycle / mitochondrial respiration         SDH       Succinate dehydrogenase / ETC complex II       TCA cycle / mitochondrial respiration         CytC       Cytochrome C, essential for ETC function       Pentose phosphate pathway         BEState       Sesential amino acid transporter       Amino acid metabolism         ASCT2       Alanine/Serine/Cysteine-preferring amino acid transporter 2       Fatty acid transporter       Fatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol       Fatty acid metabolism	ATP5A	ATP synthase / ETC complex V				
HKFirst glycolytic enzymeglycolysis / fermentationGAPDHGlycolytic enzyme / immune regulatorMCT1Lactate transportOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IICytCCytochrome C, essential for ETC function2. Broad metabolism panel **G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid metabolismCD36/FATFatty acid transporterFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	B. Extension *					
GAPDHGlycolytic enzyme / immune regulatorAMCT1Lactate transportTCA cycle / mitochondrial respirationOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IITCA cycle / mitochondrial respirationCytCCytochrome C, essential for ETC functionTCA cycle / mitochondrial respiration2. Broad metabolism panel **Soft dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayG6PDG6P dehydrogenase, rate-limiting PPP stepAmino acid metabolismCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid transporterGLSGlutamine to glutamate conversionFatty acid metabolismCD36/FATFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	НК	First glycolytic enzyme	glycolysis / fermentation			
MCT1Lactate transportTCA cycle / mitochondrial respirationOGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IICytCCytochrome C, essential for ETC function <b>E. Broad met-bolism panel **</b> G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid metabolismGLSGlutamine to glutamate conversionFatty acid metabolismCD36/FATFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	GAPDH	Glycolytic enzyme / immune regulator				
OGDHalpha-ketaglutarate dehydrogenaseTCA cycle / mitochondrial respirationSDHSuccinate dehydrogenase / ETC complex IICytCCytochrome C, essential for ETC function <b>2. Broad metabolism panel **</b> G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid transporterGLSGlutamine to glutamate conversionFatty acid metabolismCD36/FATFatty acid transporterFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	MCT1	Lactate transport				
SDHSuccinate dehydrogenase / ETC complex IICytCCytochrome C, essential for ETC function <b>a. Broad metabolism panel **</b> G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid transporterGLSGlutamine to glutamate conversionFatty acid transporterCD36/FATFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	OGDH	alpha-ketaglutarate dehydrogenase	TCA cycle / mitochondrial respiration			
CytCCytochrome C, essential for ETC function <b>2. Broad metabolism panel **</b> G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Fatty acid transporterFatty acid transporterCD36/FATFatty acid transporterFatty acid transporterFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	SDH	Succinate dehydrogenase / ETC complex II				
2. Broad metabolism panel **G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2GLSGlutamine to glutamate conversionCD36/FATFatty acid transporterFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	CytC	Cytochrome C, essential for ETC function				
G6PDG6P dehydrogenase, rate-limiting PPP stepPentose phosphate pathwayCD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2Alanine o glutamate conversionGLSGlutamine to glutamate conversionFatty acid transporterCD36/FATFatty acid transporterFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	2. Broad metabolism panel **					
CD98/LAT1Essential amino acid transporterAmino acid metabolismASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2GLSGlutamine to glutamate conversionCD36/FATFatty acid transporterFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	G6PD	G6P dehydrogenase, rate-limiting PPP step	Pentose phosphate pathway			
ASCT2Alanine/Serine/Cysteine-preferring amino acid transporter 2GLSGlutamine to glutamate conversionCD36/FATFatty acid transporterCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	CD98/LAT1	Essential amino acid transporter	Amino acid metabolism			
GLSGlutamine to glutamate conversionFatty acid transporterFatty acid metabolismCD36/FATFatty acid transporterFatty acid metabolismCPT1AFatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterolFatty acid metabolism	ASCT2	Alanine/Serine/Cysteine-preferring amino acid transporter 2				
CD36/FAT       Fatty acid transporter       Fatty acid metabolism         CPT1A       Fatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol       Fatty acid metabolism	GLS	Glutamine to glutamate conversion				
CPT1A Fatty acid shuttling into mitochondria Citrate to acetyl-CoA conversion for fatty acid and cholesterol	CD36/FAT	Fatty acid transporter	Fatty acid metabolism			
Citrate to acetyl-CoA conversion for fatty acid and cholesterol	CPT1A	Fatty acid shuttling into mitochondria				
		Citrate to acetyl-CoA conversion for fatty acid and cholesterol				
ACLY(-P) synthesis	ACLY(-P)	synthesis				
FASN Fatty acid synthase	FASN	Fatty acid synthase				
ACAC Acetyl-CoA carboxylase / Fatty acid synthesis	ACAC	Acetyl-CoA carboxylase / Fatty acid synthesis				
HIF1A Hypoxia & inflammation-induced transcription factor Metabolic regulation	HIF1A	Hypoxia & inflammation-induced transcription factor	Metabolic regulation			

\* extension of basic glycolysis/respiration panel for more detailed metabolic insight

\*\* extensive metabolic panel to be used in combination with the glycolysis & respiration panel A. (and B., if so desired) 219

- \_\_\_\_

### 225 References

Hartmann FJ, Mrdjen D, McCaffrey E, Glass DR, Greenwald NF, Bharadwaj A, Khair Z, Verberk
 SGS, Baranski A, Baskar R, Graf W, Van Valen D, Van den Bossche J, Angelo M, Bendall SC. Single-cell
 metabolic profiling of human cytotoxic T cells. Nat Biotechnol. 2020. Epub 2020/09/02. doi:
 10.1038/s41587-020-0651-8. PubMed PMID: 32868913.

Ahl PJ, Hopkins RA, Xiang WW, Au B, Kaliaperumal N, Fairhurst AM, Connolly JE. Met-Flow, a
 strategy for single-cell metabolic analysis highlights dynamic changes in immune subpopulations.
 Commun Biol. 2020;3(1):305. Epub 2020/06/14. doi: 10.1038/s42003-020-1027-9. PubMed PMID:
 32533056; PMCID: PMC7292829.

Pelgrom LR, Davis GM, O'Shaughnessy S, Wezenberg EJM, Van Kasteren SI, Finlay DK, Sinclair
 LV. QUAS-R: An SLC1A5-mediated glutamine uptake assay with single-cell resolution reveals
 metabolic heterogeneity with immune populations. Cell Rep. 2023;42(8):112828. Epub 20230719.
 doi: 10.1016/j.celrep.2023.112828. PubMed PMID: 37478011.

 Russo E, Lemaitre F, Corre B, Chikina AS, Langa-Vives F, Bousso P. SPICE-Met: profiling and imaging energy metabolism at the single-cell level using a fluorescent reporter mouse. EMBO J.
 2022;41(19):e111528. Epub 20220823. doi: 10.15252/embj.2022111528. PubMed PMID: 35997165;
 PMCID: PMC9531294.

Arguello RJ, Combes AJ, Char R, Gigan JP, Baaziz AI, Bousiquot E, Camosseto V, Samad B, Tsui
 J, Yan P, Boissonneau S, Figarella-Branger D, Gatti E, Tabouret E, Krummel MF, Pierre P. SCENITH: A
 Flow Cytometry-Based Method to Functionally Profile Energy Metabolism with Single-Cell Resolution.
 Cell Metab. 2020;32(6):1063-75 e7. doi: 10.1016/j.cmet.2020.11.007. PubMed PMID: 33264598;
 PMCID: PMC8407169.

Tans R, Dey S, Dey NS, Calder G, O'Toole P, Kaye PM, Heeren RMA. Spatially Resolved
 Immunometabolism to Understand Infectious Disease Progression. Front Microbiol. 2021;12:709728.
 Epub 20210819. doi: 10.3389/fmicb.2021.709728. PubMed PMID: 34489899; PMCID: PMC8418271.

Artyomov MN, Van den Bossche J. Immunometabolism in the single-cell era. Cell Metab.
 2020;32(5):in press.

Rappez L, Stadler M, Triana S, Gathungu RM, Ovchinnikova K, Phapale P, Heikenwalder M,
 Alexandrov T. SpaceM reveals metabolic states of single cells. Nat Methods. 2021;18(7):799-805.

Epub 20210705. doi: 10.1038/s41592-021-01198-0. PubMed PMID: 34226721; PMCID: PMC7611214.
 Lercher A, Baazim H, Bergthaler A. Systemic Immunometabolism: Challenges and
 Opportunities. Immunity. 2020;53(3):496-509. doi: 10.1016/j.immuni.2020.08.012. PubMed PMID:

257 32937151; PMCID: PMC7491485.

10. Kornberg MD, Bhargava P, Kim PM, Putluri V, Snowman AM, Putluri N, Calabresi PA, Snyder
SH. Dimethyl fumarate targets GAPDH and aerobic glycolysis to modulate immunity. Science.
2018;360(6387):449-53. Epub 20180329. doi: 10.1126/science.aan4665. PubMed PMID: 29599194;

261 PMCID: PMC5924419.

Fultang L, Booth S, Yogev O, Martins da Costa B, Tubb V, Panetti S, Stavrou V, Scarpa U,
Jankevics A, Lloyd G, Southam A, Lee SP, Dunn WB, Chesler L, Mussai F, De Santo C. Metabolic
engineering against the arginine microenvironment enhances CAR-T cell proliferation and
therapeutic activity. Blood. 2020;136(10):1155-60. doi: 10.1182/blood.2019004500. PubMed PMID:

266 32573723; PMCID: PMC7565134.

Voss K, Hong HS, Bader JE, Sugiura A, Lyssiotis CA, Rathmell JC. A guide to interrogating
immunometabolism. Nat Rev Immunol. 2021;21(10):637-52. Epub 20210415. doi: 10.1038/s41577021-00529-8. PubMed PMID: 33859379; PMCID: PMC8478710.

Verberk SGS, de Goede KE, Gorki FS, van Dierendonck X, Arguello RJ, Van den Bossche J. An
integrated toolbox to profile macrophage immunometabolism. Cell Rep Methods. 2022;2(4):100192.
Epub 2022/05/03. doi: 10.1016/j.crmeth.2022.100192. PubMed PMID: 35497494; PMCID:

273 PMC9046227.

14. Vrieling F, Zande HJPvd, Smeehuijzen L, Bossche JVd, Kersten S, Stienstra R. In-depth

275 immunometabolic profiling by measuring single-cell protein translation inhibition via bioorthogonal

- 276 noncanonical amino acid tagging (SCENITH-BONCAT). bioRxiv. 2023:2023.08.03.551800. doi:
- 277 10.1101/2023.08.03.551800.
- 278 15. Zhang Z, Cheng X, Zhao Y, Yang Y. Lighting Up Live-Cell and In Vivo Central Carbon
- 279 Metabolism with Genetically Encoded Fluorescent Sensors. Annu Rev Anal Chem (Palo Alto Calif).
- 280 2020;13(1):293-314. Epub 20200302. doi: 10.1146/annurev-anchem-091619-091306. PubMed PMID:
- 281 32119572.
- 282

#### 283 Acknowledgements

284 We thank INSERM for the "Metabolism in the single cell area" workshop held in Bordeaux from 20-22

- September 2023, organized by L.P, J.C., A.M. and R.J., which allowed to launch the initiative of this comment. IZ
   is supported by NIH grants 2R01AI121066, 2R01DK115217, 1R01AI165505, 1R01AI170632, the Lloyd J. Old
- 287 STAR Program CRI3888, and holds an Investigators in the Pathogenesis of Infectious Disease Award from the
- 288 Burroughs Welcome Fund.
- 289

#### 290 Conflict of interest

R.J.A. is main inventor of SCENITH<sup>™</sup> (Patent PCT/EP2020/060486) and in the process of licensing the

technology for commercialization of kits and providing patient samples analysis services. In the past three

293 years, C.A.L. has consulted for Astellas Pharmaceuticals, Odyssey Therapeutics, Third Rock Ventures, and T-

294 Knife Therapeutics, and is an inventor on patents pertaining to Kras regulated metabolic pathways, redox

control pathways in pancreatic cancer, and targeting the GOT1-ME1 pathway as a therapeutic approach (US

296 Patent No: 2015126580-A1, 05/07/2015; US Patent No: 20190136238, 05/09/2019; International Patent No:

WO2013177426-A2, 04/23/2015). T.A. holds several patents focused on imaging mass spectrometry and leads
 a startup on single-cell metabolomics incubated at the BioInnovation Institute. CO holds several patents on

AHR activation and tryptophan catabolism and is founder and managing directors of cAHRmeleon Bioscience

- 300 GmbH. The other authors declare no conflicts of interest.
- 301