1	An optimize	ed method to measure human FOXP3 ⁺ regulatory T cells from multiple tissue types	
2		using mass cytometry	
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 18 19 20 21 22 23 24 25 26 27 28 29 30 31 	Abbreviation ACCENSE CSB CMV FBS FMO IMDM JIA MMO PBMC PFA RT SEB Tconv	automatic classification of cellular expression by nonlinear stochastic embedding Cell Staining Buffer cytomegalovirus fetal bovine serum fluorescence minus one Iscove's Modified Dulbecco's Medium juvenile idiopathic arthritis metal minus one peripheral blood mononuclear cell paraformaldehyde room temperature Staphylococcal enterotoxin B conventional T cell	
32 33	Treg	regulatory T cell	

34 High-dimensional phenotyping with mass cytometry has allowed immunologists to discover new 35 cell populations and functions, as well as immunological networks [1]. However, there has been 36 limited use of this technology to measure transcription factors, which are often difficult to detect 37 due to their intranuclear localization and association with DNA. High and stable expression of 38 the transcription factor FOXP3 is the defining characteristic of regulatory T cells (Tregs) [2]. 39 Therefore, robust methodology to detect this protein is essential to realize the benefit of mass 40 cytometry-based analysis of Tregs in health, during the course of disease and/or in response to 41 therapy.

42

43 Several studies have reported analysis of human Tregs using mass cytometry. Specifically, 44 Mason et al analyzed pre-sorted CD4⁺CD25⁺CD127⁻ Tregs but without FOXP3 staining in their 45 mass cytometry panel [3]. In unfractionated peripheral blood, Hirakawa et al analyzed changes in 46 FOXP3 expression in graft-versus-host disease following low-dose IL-2 therapy [4], Kordasti et 47 al studied FOXP3⁺ Tregs in aplastic anemia [5], and Bengsch et al studied cytotoxic protein co-48 expression patterns [6]. In tissue, Lowther et al used mass cytometry to phenotype circulating 49 versus tumor-infiltrating FOXP3⁺ Tregs from patients with glioblastoma multiforme [7] as did 50 Chew et al in the context of hepatocellular carcinoma [8]. However, none of these studies 51 reported validation of the FOXP3 staining protocol or compared results to "gold-standard" data 52 obtained with flow cytometry. Using data from conventional flow cytometry as a benchmark, we 53 sought to optimize FOXP3 staining protocols for use in mass cytometry for optimal detection of 54 polyclonal and antigen-specific human Tregs from peripheral blood and other tissues.

56 When developing an optimal protocol to detect FOXP3 by mass cytometry, we aimed to achieve 57 clear resolution of FOXP3⁺ Tregs, minimal non-specific staining of conventional T cells (Tconvs), 58 and uncompromised detection of cell surface proteins necessary to identify Tregs and define other 59 cell types and function. We tested three buffer sets: (i) the recommended FOXP3 mass cytometry 60 staining kit from Fluidigm (#201319); (ii) the commonly used and effective eBioscience FOXP3 61 fix/perm buffer set (ThermoFisher #00-5523-00) which was developed for conventional flow 62 cytometry [9], and (iii) a custom buffer system which used paraformaldehyde (PFA)-based fixation 63 and saponin-based membrane permeabilization (termed PFA/saponin; see Supporting 64 Information). For all samples and buffers, the FOXP3 gates were set on the basis of staining in 65 live CD4-negative cells (Supporting Figure 1A). We found that all three buffer systems resulted 66 in similar proportions of FOXP3⁺ cells within the CD4⁺CD25⁺CD127⁻ gate, which is the widely 67 accepted combination of cell surface molecules used to define Tregs (Figure 1A, Supporting Figure 1A) [2, 10, 11]. This finding was confirmed using a reverse gating strategy in which the 68 69 proportion of CD25+CD127- cells within the CD4+FOXP3+ gate was determined (Supporting 70 Figure 1B). Notably, in the majority of samples, a small proportion of Tconvs (CD4⁺CD25⁻ 71 CD127⁺) displayed background staining of FOXP3 using the eBioscience staining protocol, but 72 not with the Fluidigm or PFA/saponin protocols (Figure 1A).

73

Since fixation methods can destroy or alter epitopes, negatively affecting monoclonal antibody recognition [12, 13], we next determined the effect of each FOXP3 staining protocol on detection of a range of T cell surface markers. We found that Fluidigm buffers had the greatest negative effect on several Treg-defining cell surface markers including CD3, CD4, and CD25, resulting in poor resolution of CD3⁺CD4⁺ cells (Supporting Figure 1A) as well as CD25^{hi}CD127^{lo} cells

79 (Figure 1B). In contrast, the custom PFA/saponin protocol and eBioscience buffers showed 80 equivalent and optimal detection of CD3, CD4, and CD25, supporting their use for detection of 81 CD4+CD25+CD127- Tregs. Evaluation of other Treg-associated cell surface markers revealed 82 that no single fixation method was optimal for detection of all markers tested. Although each 83 method had its respective limitations (Supporting Figure 2A&B), the PFA/saponin protocol was 84 optimal for detection of Tregs by mass cytometry because it neither caused background staining 85 of FOXP3 in Tconvs, nor diminished detection of the most important Treg-defining cell surface 86 molecules, namely CD4, CD25, and CD127. These data highlight the importance of determining 87 the impact of fixation methods used to measure nuclear proteins on detection of other 88 cytoplasmic or cell surface markers of interest.

89

90 Having identified an optimal method for staining FOXP3 via mass cytometry, we next compared 91 mass cytometry data obtained using the PFA/saponin protocol and mass cytometry to 92 conventional fluorescence flow cytometry. Since human immune cells are often analyzed after 93 cryopreservation, we also compared data from ex vivo or cryopreserved cells on both platforms. 94 We found that cell surface marker detection was similar for most antigens tested on both 95 platforms (Supporting Figure 3A-E), with the notable exception of significantly lower 96 proportions of CCR4-expressing CD3+CD4+ T cells in mass cytometry. This difference was 97 likely at least partially due to differential CCR4 clone sensitivity (Supporting Figure 3F), 98 highlighting the need to for careful antibody clone selection for optimal resolution in mass (as 99 well as flow) cytometry.

101 For both ex vivo and cryopreserved samples, the proportion of FOXP3-expressing cells 102 (PCH101 clone) detected via mass cytometry was significantly lower than that detected via flow 103 cytometry (Figure 1C, Supporting Figure 4). This difference may be due to fundamental 104 differences related to the chemical properties of fluorophores and metals, possibly resulting in a 105 differential ability of metal- versus fluorochrome-conjugated antibodies to pass through the 106 nuclear membrane. However, within each platform, there was no significant difference in the 107 proportion of FOXP3⁺ cells detected in matched ex vivo versus cryopreserved samples (Figure 108 1D).

109

To determine if this reduced detection of FOXP3 in mass cytometry may be a limitation of the PCH101 clone, we repeated the experiment using the FOXP3 clone 236A/E7 and found similar results (Figure 1E). This difference between flow and mass cytometry FOXP3 staining may, in part, be related to the fact that even the most sensitive metals (eg. 162Dy) are less sensitive than the brightest fluorophores (eg. PE) [14, 15].

115

116 It is often desirable to detect antigen-specific Tregs, so we next assessed the ability of the 117 PFA/saponin protocol to enumerate FOXP3+ Tregs within a population of antigen-specific CD4+ 118 T cells. Blood was stimulated with the indicated antigen for 44 hours and antigen-specific CD4+ 119 T cells were detected by measuring induced co-expression of CD25 and OX40 [16] by flow or 120 mass cytometry. Optimal methods to detect FOXP3 in whole blood by flow or mass cytometry 121 were used (see Supporting Information). The proportion of FOXP3-expressing cells within the 122 CD4+CD25+OX40+ gate was determined (Supporting Figure 5A). Consistent with the fact that 123 Tregs comprise a substantial proportion of recall responses [17], we found that both mass

cytometry and flow cytometry detected a clear population of FOXP3⁺ cells within the antigenspecific cell gate. The proportion of antigen-specific CD4⁺ responder cells detected by mass
cytometry was similar to flow cytometry (Supporting Figure 5B). Notably, in contrast to ex vivo
cells, the proportion of FOXP3⁺ cells detected by mass cytometry was similar to that detected
with flow cytometry (Supporting Figure 5A).

129

130 We next tested the applicability of the PFA/saponin-based FOXP3 staining protocol to detect 131 CD4⁺CD25⁺CD127⁻ Tregs in samples other than peripheral blood via mass cytometry. 132 Specifically, mononuclear cells from umbilical cord blood, CD8-depleted thymocytes, or 133 synovial fluid from juvenile idiopathic arthritis (JIA) patients were stained with a panel of T cell 134 and Treg-related markers, including FOXP3. Data were analyzed with ACCENSE [18], which 135 compares cells on a two-dimensional plot while maintaining single cell resolution and 136 complexity, and then further identifies statistically significant subpopulations (Figure 2A). The 137 relative expression of each marker within each of the 25 ACCENSE-defined populations, as well 138 as their relative abundance within each tissue, was determined and plotted on heat maps (Figure 139 2B). Strikingly, Tregs preferentially clustered into ACCENSE populations by tissue source. For 140 example, Treg populations of in cord blood were uniquely identified by high CD45RA, whereas 141 Treg populations in JIA synovial fluid were defined by high expression of multiple 142 activation/effector molecules, with a specific enrichment for high PD-1 expression. Despite 143 strong tissue-specific segregation, a few populations were shared between tissues. For instance, a 144 subset of CD45RA⁺ Tregs (population 4) was found in both peripheral blood and cord blood, and 145 populations 3 (CD127⁺) and 15 (low for all markers) were present in cord blood and thymus. 146 Overall, these results support a growing body of evidence indicating that Tregs acquire unique

tissue-specific phenotypes and that phenotypes in peripheral blood may not reflect those oftissue-resident cells [19, 20].

149

150 In conclusion, we have developed an optimal protocol to detect FOXP3 by mass cytometry, 151 tested its suitability in ex vivo and cryopreserved samples, and shown its utility in a broad range 152 of immune cell sources. We have further shown that antigen-specific FOXP3⁺ Tregs can be 153 detected by mass cytometry in whole blood. An important consideration is that, at least in ex 154 vivo peripheral blood samples, mass cytometry is significantly less sensitive than traditional 155 fluorescence flow cytometry at detecting FOXP3 expression. Overall, our optimized 156 PFA/saponin protocol is the best-validated method described to date to detect FOXP3 expression 157 by mass cytometry without compromising detection of cell surface markers. This method will 158 enhance high-dimensional studies of Treg phenotype and function in the context of complex 159 cellular networks.

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171	
172	Author contributions: NAJD designed and conducted experiments, analyzed data, and wrote
173	the manuscript. AJL designed and conducted experiments, analyzed data, and critically reviewed
174	the manuscript. LC designed and conducted experiments, critically reviewed the manuscript, and
175	provided experimental design guidance. REH and AMP contributed to experiment design,
176	reviewed results, and critically reviewed the manuscript. RB secured funding and contributed to
177	experimental design. MKL secured funding, provided overall guidance for experimental design
178	and interpretation, and wrote the manuscript.
179	

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207 Figure Legends

209 Figure 1. Development of a FOXP3 staining protocol for mass cytometry and comparison to 210 flow cytometry. (A) Fresh or thawed, cryopreserved PBMCs were stained with the indicated 211 monoclonal antibodies using the Fluidigm FOXP3 or eBioscience FOXP3 Staining Kit, or fixed 212 in paraformaldehyde (PFA) and stained in the presence of saponin (PFA/saponin). Samples were 213 analyzed by mass cytometry after an overnight DNA intercalation step. Viable (cisplatin⁻) bead⁻ 214 DNA1⁺DNA2⁺CD3⁺CD4⁺ single cells were divided into CD25⁺CD127⁻ or CD25⁻⁻CD127⁺⁺ 215 fractions, then analyzed for FOXP3 expression (see Figure S1A for example gating). 216 Representative (left) and summarized (n=7) data (right). (B) PBMCs were prepared as in (A) and 217 analyzed on a mass cytometer. Shown are the mean counts of each target within the viable 218 (cisplatin⁻) bead⁻DNA1⁺DNA2⁺CD3⁺CD4⁺ single cell gate for each fixation method. Data from 219 n=7 individual donors are shown. Shown are cell surface molecules important for Treg lineage 220 identification. (C&D) PBMCs (n=8) were divided and either cryopreserved or analyzed 221 immediately using eBioscience FOXP3 staining buffers and flow cytometry or PFA/saponin 222 fixation and metal-tagged antibodies for mass cytometry. The FOXP3 (PCH101 clone) gate was 223 set on the basis of a viable (cisplatin⁻) bead⁻DNA1⁺DNA2⁺CD3⁺CD4⁻ single cell gate. 224 Representative (left) and individual (n=4-8) data (right). Each line is data from one individual 225 with data collected in at least three independent experiments. (E) Cryopreserved PBMCs (n=4) 226 were stained as in (C-D) using the 236A/E7 FOXP3 clone or a fluorescence/metal minus one 227 (FMO/MMO) control. Representative (left) and individual (n=4) data (right). Each line is data 228 from one individual with data collected in one independent experiment. For (A-B), statistical 229 significance was determined with a one-way ANOVA with a Tukey multiple comparisons post-

test. For (C-E), statistical significance was determined with two-tailed paired t tests. * p < 0.05,
** p < 0.01, **** p < 0.0001

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233 Figure 2. ACCENSE analysis of Tregs in peripheral blood, cord blood, thymus, and JIA

234 synovial fluid. (A) Cryopreserved mononuclear cells from the indicated tissues were stained with

the PFA/saponin method and analyzed by mass cytometry (n=3-4 per tissue). Data from viable

236 (cisplatin⁻) bead⁻DNA1⁺DNA2⁺CD3⁺CD4⁺CD25⁺CD127⁻ single cells from each tissue were

237 pooled and analyzed using ACCENSE v0.5.0-beta (Barnes-Hut-SNE dimension reduction and k-

238 means significance of 10^{-8}). (B) Heat map analysis of mean count expression of each protein

included in the ACCENSE analysis was completed using FlowJo v10.3 and R v3.3.2 statistical

240 software. ACCENSE populations were clustered by tissue frequency. Average marker expression

241 was normalized across all populations using Z-score analysis to highlight the range of individual

242 marker expression in different populations. Average population frequency was normalized

243 within each population using Z-score analysis to emphasize which tissues were enriched for each

ACCENSE population. Data shown are representative of two independent experiments.

Figure 1

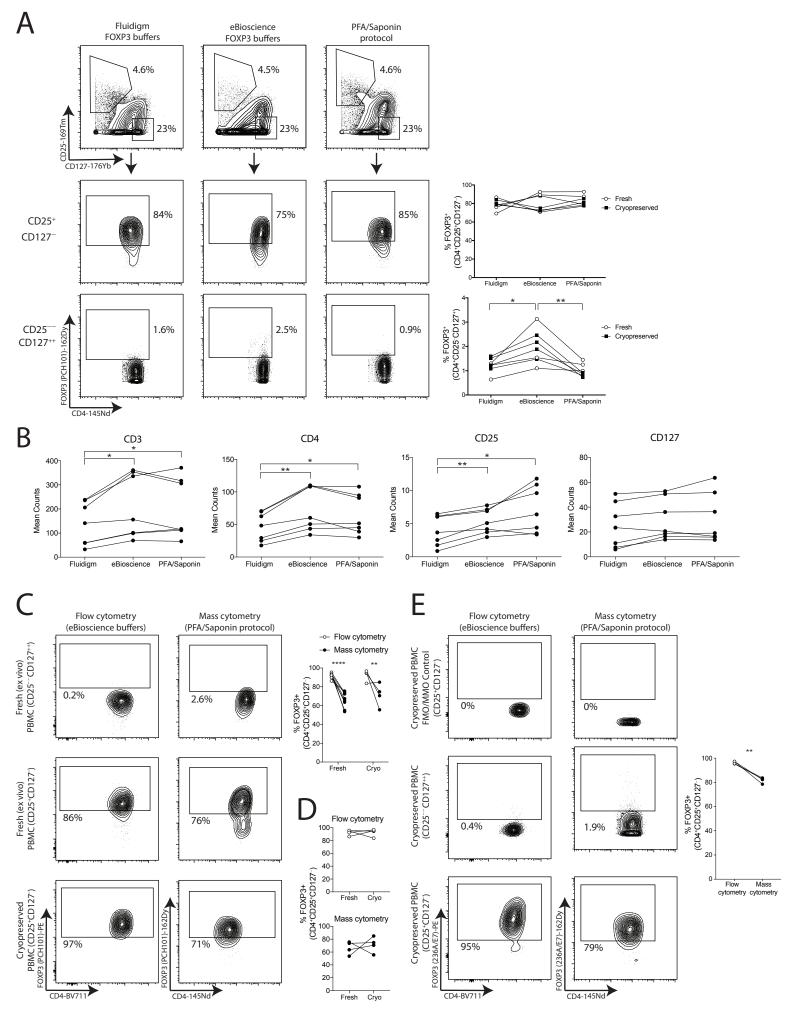


Figure 2

