- 1 Macrophage Innate Training Induced by IL-4 Activation Enhances OXPHOS Driven Anti-
- 2 Mycobacterial Responses

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### 18 Abstract

Macrophages are key innate immune cells for determining the outcome of Mycobacterium 19 20 tuberculosis infection. Polarization with IFNy and LPS into the "classically activated" M1 macrophage 21 enhances pro-inflammatory and microbicidal responses, important for eradicating the bacterium. By 22 contrast, "alternatively activated" M2 macrophages, polarized with IL-4, oppose bactericidal 23 mechanisms and allow mycobacterial growth. These activation states are accompanied by distinct 24 metabolic profiles, where M1 macrophages favor near exclusive use of glycolysis, whereas M2 25 macrophages up-regulate oxidative phosphorylation (OXPHOS). Here we demonstrate that activation 26 with IL-4 counterintuitively induces protective innate memory against mycobacterial challenge. This 27 was associated with enhanced pro-inflammatory cytokine responses and killing capacity. Moreover, 28 despite this switch towards a phenotype that is more akin to classical activation, IL-4 trained 29 macrophages do not demonstrate M1-typical metabolism, instead retaining heightened use of 30 OXPHOS. Moreover, inhibition of OXPHOS with oligomycin, 2-deoxy glucose or BPTES all impeded 31 heightened pro-inflammatory cytokine responses from IL-4 trained macrophages. Lastly, this work 32 identifies that IL-10 negatively regulates protective IL-4 training, impeding pro-inflammatory and 33 bactericidal mechanisms. In summary, this work provides new and unexpected insight into alternative 34 macrophage activation states in the context of mycobacterial infection.

#### 36 Introduction

Mycobacterium tuberculosis, the causative agent of tuberculosis (TB), has arguably caused the most 37 38 deaths of any pathogen in human history. *M. tuberculosis* continues to be the cause of more than a 39 million deaths annually: in 2018, 10 million people were newly diagnosed with active TB and 1.4 40 million died from the disease (WHO, 2019). The only currently licensed TB vaccine, Bacille Calmette-41 Guérin (BCG), was developed a century ago and although it protects children against disseminated 42 disease, it fails to protect adults from pulmonary infection (Ryndak & Laal, 2019). The lack of an 43 efficient vaccine, and growing antibiotic resistance, means that new ways of combatting TB are urgently needed (Choreño-Parra, Weinstein, Yunis, Zúñiga, & Hernández-Pando, 2020). 44

Macrophages are key host innate immune cells for controlling *M. tuberculosis* infection 45 46 (Cohen et al., 2018). A significant feature of macrophages is dynamic plasticity, expressed by their ability to polarize towards distinct activation states (M. L. E. Lundahl, Scanlan, & Lavelle, 2017; Sica, 47 48 Erreni, Allavena, & Porta, 2015). Activation with interferon gamma (IFNy) together with lipopolysaccharides (LPS) yields the bactericidal and pro-inflammatory "classically activated" or M1 49 macrophages (Ferrante & Leibovich, 2012; Sica et al., 2015), whereas activation with the type 2 and 50 51 regulatory cytokines, interleukin (IL)-4, IL-13, IL-10 and transforming growth factor (TGF)β, results in 52 "alternatively activated" M2 macrophages, which enhance allergic responses, resolve inflammation 53 and induce tissue remodeling (Bystrom et al., 2008; Mantovani et al., 2004). Another key difference 54 between these activation states are their metabolic profiles: whereas classically activated 55 macrophages switch to near exclusive use of glycolysis to drive their ATP production, alternatively 56 activated macrophages instead upregulate their oxidative phosphorylation (OXPHOS) machinery (Van 57 den Bossche et al., 2016; Van den Bossche, O'Neill, & Menon, 2017).

Whilst classifying macrophages in this manner is a simplification – the reality is a broad 58 spectrum of various differentiation states that is continuously regulated by a myriad of signals (Sica et 59 al., 2015) – it is nevertheless considered that for a host to control TB infection, classical macrophage 60 61 activation is vital (Jouanguy et al., 1999; Philips & Ernst, 2012). Furthermore, a macrophage metabolic 62 shift to glycolysis is crucial for effective killing and thus overall control of TB infection (Gleeson et al., 63 2016; Huang, Nazarova, Tan, Liu, & Russell, 2018). By contrast, alternatively activated macrophages 64 directly oppose bactericidal responses, which has been demonstrated to lead to enhanced bacterial 65 burden and TB pathology (Moreira-Teixeira et al., 2016; Orecchioni, Ghosheh, Pramod, & Ley, 2019; 66 Shi, Jiang, Bushkin, Subbian, & Tyagi, 2019). Due in large part to the established ability of classically 67 activated macrophages to kill M. tuberculosis, inducing Th1 immunity is a key aim for TB vaccine 68 development (Abebe, 2012; Andersen & Kaufmann, 2014; Ottenhoff et al., 2010). Apart from targeting 69 adaptive immune memory, another promising approach has emerged in recent years: bolstering innate immune killing capacity by the induction of innate training (Khader et al., 2019; Moorlag et al.,2020).

72 Innate training is regarded as a form of immunological memory. It is a phenomenon where a 73 primary challenge, such as a vaccination or an infection, induces epigenetic changes in innate immune 74 cells, which alters their responses following a secondary challenge (Arts et al., 2018; Saeed et al., 2014; 75 van der Meer, Joosten, Riksen, & Netea, 2015). Unlike adaptive immune memory, innate training is 76 non-specific, i.e. the secondary challenge does not need to be related to the primary challenge. For 77 instance, BCG vaccination has been demonstrated to protect severe combined immunodeficiency 78 (SCID) mice from lethal Candida albicans infection; reducing fungal burden and significantly improving 79 survival (Kleinnijenhuis et al., 2012). This ability of the BCG vaccine to train innate immunity is now 80 believed to be a core mechanism by which it induces its protection against *M. tuberculosis*. Apart from 81 the BCG vaccine, it has been demonstrated that other organisms and compounds can induce innate 82 training, such as  $\beta$ -glucan (van der Meer et al., 2015) which induced protective innate training against 83 virulent M. tuberculosis, as shown by enhanced mouse survival following in vivo infection, and 84 enhanced human monocyte pro-inflammatory cytokine secretion following ex vivo infection (Moorlag 85 et al., 2020).

86 Conversely, there is a risk that certain immune challenges could lead to innate immune reprogramming that hinders protective immune responses. For instance, recent reports have 87 88 demonstrated how virulent *M. tuberculosis* (N. Khan et al., 2020) and mycobacterial phenolic glycans 89 (M. Lundahl et al., 2020) can program macrophages to attenuate bactericidal responses to subsequent 90 mycobacterial challenge. In the current study, macrophage activation caused by former or concurrent 91 parasitic infections is considered regarding the possibility of innate immune re-programming that 92 hinders protective immune responses against this disease. Geographically, there is extensive overlap between tuberculosis endemic areas and the presence of helminths (Salgame, Yap, & Gause, 2013). 93 94 With regard to macrophage activation and combatting tuberculosis, this is an issue as parasites induce 95 type 2 responses, leading to alternative macrophage activation instead of classical activation and 96 associated bactericidal responses (Chatterjee et al., 2017; X. X. Li & Zhou, 2013). Indeed, it was recently 97 demonstrated how products of the helminth Fasciola hepatica can train murine macrophages for 98 enhanced secretion of the anti-inflammatory cytokine IL-10 (Quinn et al., 2019).

99 Unexpectedly, our data indicates that murine macrophage activation with IL-4 and IL-13 100 induces innate training that enhances pro-inflammatory and bactericidal responses against 101 mycobacteria. Although macrophages trained with IL-4 and IL-13 resemble classically activated 102 macrophages, we identify that they do not adopt their typical metabolic profile, instead retaining 103 heightened OXPHOS activity and notably lacking a dependency on glucose and glycolysis. Lastly, we

identify IL-10 as a negative regulator of this innate training response, which may have obscuredprevious identification of this macrophage phenotype.

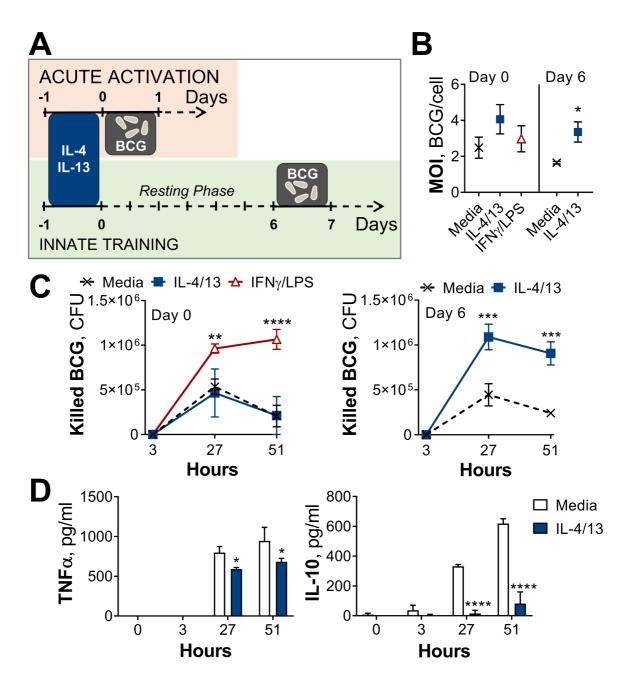
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#### 107 **Results**

#### 108 Prior Alternative Activation Enhances Mycobacterial Killing

109 Macrophages are key immune cells for combatting M. tuberculosis. Upon infection, alveolar 110 macrophages serve as the initial hosts of the intracellular bacterium (Cohen et al., 2018) and 111 bactericidal responses of recruited monocyte-derived macrophages (MDM) are crucial for control and 112 killing of *M. tuberculosis* (Huang et al., 2018). Overall, it has been highlighted that an early Th1 driven 113 immune response is key to early eradication of M. tuberculosis, where classical activation of macrophages results in effective bactericidal action. However, a complicating factor is the occurrence 114 115 of concurrent parasitic disease, which instead drives Th2 immunity and alternative macrophage activation, which in turn has been demonstrated to enhance TB pathology (Moreira-Teixeira et al., 116 117 2016; Orecchioni et al., 2019). In this context, we sought to investigate how type 2 responses may 118 induce innate memory, and how such memory could affect macrophage bactericidal properties.

119 To investigate the effect of IL-4 and IL-13 on macrophage acute and innate memory responses, an in vitro model of BCG infection was used. Murine bone marrow-derived macrophages (BMDMs) 120 121 were stimulated with IL-4 and IL-13 (M(4/13)) on Day -1, followed by infection with BCG Denmark on either Day 0 or Day 6 (Figure 1A). On either day, the macrophages were exposed to roughly 30 bacteria 122 per cell and after three hours extracellular bacteria were removed by washing and internalized 123 bacteria were measured by colony forming units (CFUs), resulting in a multiplicity of infection (MOI) 124 125 between one and four, depending on differences in uptake (Figure 1B). Internalized bacteria were 126 measured by CFU (Figure S1A) at 27- and 51 hours post infection to determine killing capacity (Figure 1C). 127



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129 Figure 1. Training with IL-4 and IL-13 enhances BMDM mycobacterial killing capacity.

130 (A) Schematic of protocol for BCG infection following acute activation (Day 0) or training (Day 6) with IL-4 and 131 IL-13. (B-C) BCG Denmark MOI (B) and killing after h as indicated (C), measured by CFU per  $0.5 \times 10^6$  BMDMs on 132 Day 0 or Day 6. BMDMs were incubated with media, IL-4 with IL-13 or IFNy with LPS for 24 h on Day -1. (D) 133 Secretion of indicated cytokines from BMDMs treated as in (C), standardized to  $0.5 \times 10^6$  BMDMs. (B-D) 134 Representative results (n = 2) showing mean ± SEM (B-C) or ± STD (D) and analyzed by student's t-test (B) or 135 multiple t-tests, with Holm-Sidak correction (C-D), compared with media control. \* p ≤ 0.05, \*\* p ≤ 0.01, \*\*\*\* p 136 ≤ 0.0001.

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Mycobacterial killing was compared to naïve BMDMs incubated with media on day -1 (media control,
M(-)) on both Days 0 and 6, and BMDMs classically activated with IFNγ and LPS (M(IFNγ/LPS)) on Day
0. M(IFNγ/LPS) could not be investigated on Day 6 due to reduced viability. On Day 0, M(IFNγ/LPS)
displayed significantly enhanced mycobacterial killing at 27- and 51-hours post infection, whereas

142 M(4/13) displayed comparable killing capacity to naïve M(-) (Figure 1C). Secretion of TNF $\alpha$  and IL-10 143 were also measured at 3-, 27- and 51 hours post infection on Day 0 (Figure S1B) and Day 6 (Figure 144 **1D**). These cytokines were chosen as TNF $\alpha$  is critical in the early host response against *M. tuberculosis* 145 (Bourigault et al., 2013; Keane et al., 2001), while IL-10 can prevent phagolysosome maturation in 146 human macrophages (O'Leary, O'Sullivan, & Keane, 2011) and promote disease progression in mice 147 (Beamer et al., 2008). Following BCG infection on Day 0 (Figure S1B), IL-10 was not detectable and 148 bactericidal M(IFNy/LPS) secreted TNF $\alpha$ . Consistent with previous work, activation with IL-4 and IL-13 149 on the other hand did not enhance BCG killing nor induce inflammatory cytokine secretion.

By contrast, on Day 6 (innate training responses), M(4/13) exhibited both heightened mycobacterial uptake (**Figure 1B**) and significantly greater killing capacity compared with untrained M(-), both at 27- and 51 hours post infection (**Figures 1C** and **S1A**). Furthermore, this was accompanied by a near complete abrogation of IL-10 secretion, along with a minor decrease of TNFα compared with M(-) (**Figure 1D**), displaying an overall shift towards a more pro-inflammatory response profile. To investigate the change in phenotype of M(4/13) between the two days tested, a more detailed characterization was carried out.

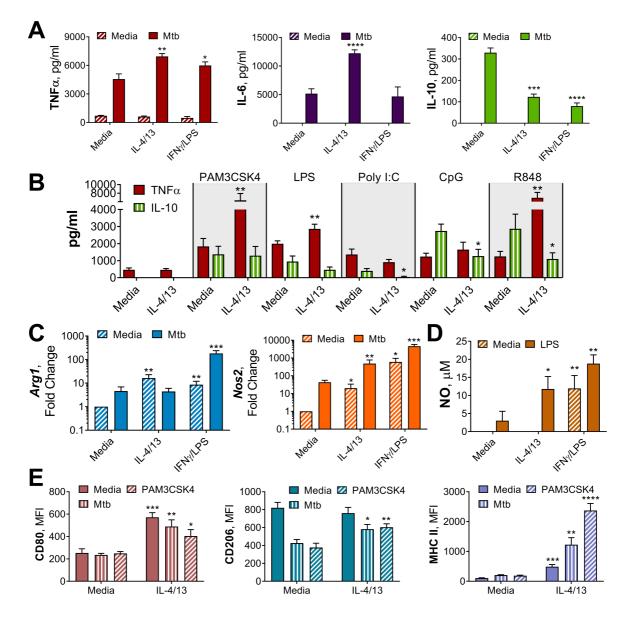
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#### 158 Innate Training with IL-4 and IL-13 Promotes Pro-Inflammatory Responses

The current dogma suggests that classical (M1) macrophage activation induces upregulation of 159 160 antigen presentation, enhanced secretion of pro-inflammatory cytokines including interleukin (IL)-1β, 161 IL-6 and TNF $\alpha$ , as well as the production of reactive oxygen and nitrogen species (ROS and RNS 162 respectively) (Bystrom et al., 2008; Sica et al., 2015). By contrast, alternatively activated macrophages (M2) dampen inflammation, promote angiogenesis and scavenge debris (Gordon & Martinez, 2010; 163 164 Sica et al., 2015). These macrophages are identified by their upregulation of chitinase-like 3-1 (Chil3), 165 found in inflammatory zone-1 (Fizz1, Retnla) and arginase (Arg1) (Gabrilovich, Ostrand-Rosenberg, & 166 Bronte, 2012; Murray & Wynn, 2011), as well as surface expression of lectins, such as the macrophage 167 mannose receptor (MR, CD206) (Brown & Crocker, 2016). Flow cytometry and qPCR analysis of 168 M(IFNy/LPS) and M(4/13), compared with inactivated M(-), showed that these activation phenotypes 169 tallied with the literature: M(IFNy/LPS) had elevated expression of CD80, major histocompatibility 170 complex class II (MHC II) and inducible nitric oxide synthase (iNOS, Nos2) – responsible for production 171 of the reactive nitrogen species, nitric oxide (NO) – whereas M(4/13) exhibited heightened expression 172 of CD206, MHC II, Arg1, Chil3 and Retnla (Figures S2A-C).

173To examine their respective cytokine response profiles, M(IFNγ/LPS) and M(4/13) were174stimulated with killed *M. tuberculosis* strain H37Rv (hereafter referred to as Mtb) or the TLR1/2 ligand175tripalmitoyl-S-glyceryl-cysteine (PAM3CSK4) on either Day 0 or Day 6. Acutely activated M(IFNγ/LPS)176demonstrated elevated secretion of TNFα, IL-6 and IL-10 in response to Mtb (Figure S2D) and elevated

TNFα and IL-6 in response to PAM3CSK4 (Figure S3A), compared with M(-). By contrast, M(4/13) had attenuated secretion of each cytokine compared with M(-), following either Mtb or PAM3CSK4 stimulation. However, on Day 6 (innate memory responses), both M(IFNy/LPS) and M(4/13) secreted greater pro-inflammatory TNF $\alpha$  and reduced anti-inflammatory IL-10 in response to Mtb (Figure 2A), and secreted elevated TNF $\alpha$  following PAM3CSK4 stimulation (Figure S3B). M(4/13) additionally exhibited increased IL-6 secretion in response to both stimuli. As with the BCG infection, M(IL-4/13) responses changed markedly between Day 0 and Day 6, shifting towards a pro-inflammatory response profile which was similar to classically activated macrophages. 



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191 Figure 2. Innate training of BMDMs with IL-4 and IL-13 enhances pro-inflammatory responses.

192(A-B) Cytokine secretion following BMDM 24 h incubation with irradiated *M. tuberculosis* (Mtb) (A), TLR agonists193(B) or media on Day 6 as indicated. BMDMs were previously incubated with media, IL-4 with IL-13 or IFNy with194LPS on Day -1 for 24 h (n = 3). (C) qPCR of indicated mRNA in BMDMs treated as in (A), standardized to BMDMs195incubated with media Day -1 and Day 6 (n = 4). (D) Nitric oxide (NO) secretion from BMDMs treated as in (B) (n196= 3). (E) Expression of CD80, CD206 and MHC II (gating strategy Figure S2A) on BMDMs treated as in (A-B) (n =1973). Mean ± SD are shown and analyzed by student's t-test, compared with media control. \* p ≤ 0.05, \*\* p ≤ 0.01,\*\*\* p ≤ 0.001, \*\*\*\* p ≤ 0.0001.

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To consider whether the shift in M(4/13) to a pro-inflammatory cytokine profile was dependent on epigenetic changes, the DNA methylation inhibitor 5'-deoxy-5'-(methylthio)adenosine (MTA), was employed. This inhibitor has been demonstrated to impede training by BCG (Kleinnijenhuis et al., 2012) and  $\beta$ -glucan (Quintin et al., 2012) – which promote pro-inflammatory responses – as well as training induced by helminth *Fasciola hepatica* total extract (Quinn et al., 2019), which enhances antiinflammatory responses such as IL-10 and IL-1Ra secretion. The addition of MTA prior to activation with IL-4 and IL-13 on day -1 reduced TNFα, IL-6 and IL-10 secretion induced by either Mtb or
PAM3CSK4 on Day 6 (Figure S3C), resulting in a profile reminiscent of acutely activated M(4/13)
(Figure S2D). By contrast, inhibition of DNA methylation in M(-) resulted in comparable or even
increased cytokine secretion. This suggested that DNA methylation following IL-4 and IL-13 activation
contributed to the innate training and subsequent enhancement of pro-inflammatory responses.

211 Next, we addressed whether the shift towards pro-inflammatory responses was applicable to 212 other stimuli, trained M(4/13) were incubated with various Toll-like receptor (TLR) agonists on Day 6 213 (**Figure 2B**). Incubation of cells with ligands for TLR1/2, TLR4, TLR7/8 or TLR 9 resulted in an increase 214 of TNF $\alpha$  production, reduced IL-10 secretion or both. This demonstrated that prior activation with IL-215 4 and IL-13 caused a subsequent shift towards a pro-inflammatory response profile in response to a 216 range of pathogen-related agonists.

Having considered cytokine responses, the expression of *Arg1* and *Nos2* and the secretion of NO were next addressed. In mice, the induction of iNOS is important for bactericidal NO production and subsequent killing of *M. tuberculosis* (Flynn et al., 1993; Pasula, Martin, Kesavalu, Abdalla, & Britigan, 2017). In turn, Arg1 directly impedes the bactericidal function of iNOS by sequestering the amino acid, arginine, which each enzyme uses to make their respective products: ornithine and NO. Subsequently, in the murine model of TB infection, Arg1 has been linked with increased bacterial burden and pathology (Moreira-Teixeira et al., 2016).

224 Without a secondary stimulation on Day 6, M(4/13) and M(IFNy/LPS) displayed higher levels 225 of Arg1 and Nos2 expression, compared with BMDMs incubated in media alone (Figure 2C), and M(IFNy/LPS) exhibited markedly higher expression of Nos2 compared with M(4/13). Following 226 227 stimulation with Mtb (Figure 3C) or PAM3CSK4 (Figure S3D) M(IFNy/LPS) exhibited elevated 228 expression of both Arg1 and Nos2 compared with untrained M(-), however the trained M(4/13)exhibited equivalent expression of Arg1, but with enhanced Nos2, demonstrating a further shift 229 230 towards an M1 profile. An increase in NO production could not be detected following Mtb stimulation; 231 however, following LPS stimulation, both M(4/13) and M(IFNy/LPS) secreted greater levels of NO 232 compared to M(-) (Figure 2D).

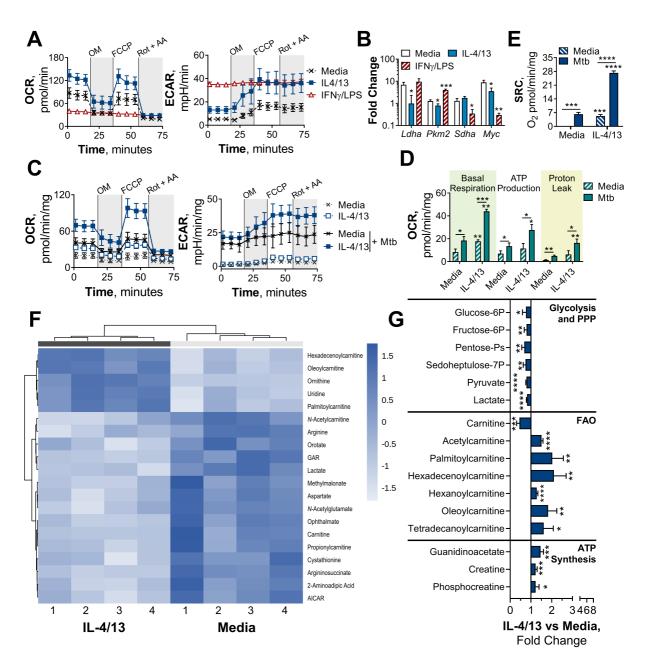
Other M1 and M2 markers were analyzed by flow cytometry, following incubation with media, Mtb or PAM3CSK4 on Day 6 (**Figure 2E**). Without secondary stimulation, M(4/13) exhibited an M1typical profile: heightened expression of CD80 and MHC II, whilst CD206 expression was comparable to M(-). Following secondary stimulation with either Mtb or PAM3CSK4, M(4/13) CD80, CD206 and MHC II expression was significantly greater compared with M(-). Having observed a change in activation markers, cytokine induction and bactericidal capacity in M(4/13) between Days 0 and 6, the next question was whether there was a corresponding shift in glycolytic metabolism.

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### 241 BMDMs Trained with IL-4 and IL-13 Retain OXPHOS Metabolism

242 The increased energy and biosynthetic precursor demand induced by various macrophage activation 243 states are met in distinct ways. Consistent with previous studies, M(4/13) on Day 1 displayed both an 244 increase of oxygen consumption rate (OCR) - indicative of mitochondrial OXPHOS activity - and 245 extracellular acidification rate (ECAR) - an indirect measurement of lactic acid secretion and thus indicative of glycolysis (Figure 3A). This demonstrated how alternative activation is intrinsically linked 246 247 with enhanced mitochondrial OXPHOS activity, via the tricarboxylic acid (TCA) cycle (Van den Bossche 248 et al., 2016; Wang et al., 2018). The TCA cycle is in turn driven by glycolysis, glutaminolysis and fatty 249 acid oxidation (Viola, Munari, Sánchez-Rodríguez, Scolaro, & Castegna, 2019). By contrast, acutely 250 activated M(IFNy/LPS) displayed an increase in ECAR and reduced OCR (Figure 3A), which was 251 indicative of augmented glycolysis to meet the increased need for ATP, whilst ATP synthesis via OXPHOS is hindered (Liu et al., 2016). This glycolytic shift is critical for pro-inflammatory responses 252 253 induced by classically activated macrophages and moreover results in mitochondrial dysfunction (Van

den Bossche et al., 2016).



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Figure 3. BMDMs trained with IL-4 and IL-13 retain M2-typical metabolism upon mycobacterial challenge.

258 (A) Extracellular flux analysis of BMDMs, following 24 h incubation with IL-4 and IL-13, IFNy and LPS or media (n 259 = 2). (B) qPCR of indicated mRNA in BMDMs following incubation with media, IL-4 with IL-13 or IFNy with LPS for 260 24 h on Day -1 and stimulated with irradiated *M. tuberculosis* (Mtb) for 6 h (*Pkm2*) or 24 h (*Ldha, Sdha* and *Myc*), standardized to BMDMs given media on Day -1 and Day 6 (n = 3). (C-E) Extracellular flux analysis (C), basal 261 respiration, ATP production, proton leak (D) and spare respiratory capacity (SRC) (E) of BMDMs treated as in (B), 262 263 with incubation with media or IL-4 with IL-13 on Day -1 and stimulation with media or Mtb for 24 h on Day 6 (n 264 = 3). (F-G) Metabolites from BMDMs treated as in (B), incubated with media or IL-4 with IL-13 on Day -1 and 265 stimulation with Mtb for 24 h on Day 6 (n = 4). MetaboAnalyst generated heatmap representing hierarchical clustering of the top 20 most up/down regulated metabolites (F). Fold change compared with media control (=1) 266 267 (G). Mean  $\pm$  SD are shown and analyzed by student's t-test. \*  $p \le 0.05$ , \*\*  $p \le 0.01$ , \*\*\*  $p \le 0.001$ , \*\*\*\*  $p \le 0.001$ , \*\*\*\* 268 0.0001. Abbreviations: AA, antimycin-A; AICAR, aminoimidazole carboxamide ribonucleotide; ECAR, 269 extracellular acidification rate; FAO, fatty acid oxidation; GAR, glycinamide ribonucleotide; OCR, oxygen 270 consumption rate; P, phosphate; PPP, pentose phosphate pathway; Rot, rotenone.

272 Due to the link between glycolysis and classical activation, it is not surprising that prior work has 273 proposed that a macrophage glycolytic shift is crucial for effective killing and thus overall control of 274 TB infection (Gleeson et al., 2016; Huang et al., 2018). Furthermore, it has recently been proposed 275 that *M. tuberculosis* impedes this glycolytic shift as an immune evasion strategy (Hackett et al., 2020). 276 As we had observed that innate memory responses induced by IL-4 and IL-13 caused a switch towards a pro-inflammatory and bactericidal response profile, akin to a classically activated macrophage, it 277 278 was pertinent to address whether there was an accompanying glycolytic shift. Previous work by Van 279 den Bossche et al. has highlighted that because IL-4 activated human MDMs retain their metabolic 280 versatility, they are able to be "re-polarized" to a classical phenotype (Van den Bossche et al., 2016). 281 This was demonstrated by activating MDMs for 24 hours with IL-4, before the cells were washed and 282 re-stimulated with IFNy and LPS for another 24 hours. MDMs previously activated with IL-4 secreted 283 higher concentrations of TNF $\alpha$ , IL-6 and IL-12 compared with MDMs that were naïve prior to IFNy and 284 LPS stimulation. This adaptive quality to re-polarize is restricted to alternatively activated macrophages, as mitochondrial dysfunction in classically activated macrophages prevents them from 285 286 re-polarizing to an alternative phenotype (Van den Bossche et al., 2016). Subsequently, we next 287 addressed whether the IL-4 trained macrophages were adopting a metabolic profile similar to a classical macrophage, or retaining their more versatile metabolic profile. 288

289 As with the BCG infection studies, due to the reduced viability of the M(IFNy/LPS) by Day 6 290 and 7, OCR and ECAR measurements did not reach the detection limit. To compare metabolic 291 phenotypes of the trained macrophages at these later time points, transcription profiles were 292 therefore analyzed. Prior work has established that the transcription factor hypoxia-inducible factor-293 1 alpha (HIF-1 $\alpha$ ) aids the glycolytic metabolic shift following classical activation, such as upregulating the enzyme lactate dehydrogenase (LDH) (Seth et al., 2017) to increase lactic acid fermentation. 294 295 Tallying with these studies, trained M(IFNy/LPS) on Day 7 exhibited elevated expression of LDH (*Ldha*) 296 and pyruvate kinase isozyme M2 (PKM2, Pkm2) (Figure S4A). PKM2 has been shown to play a key role 297 in stabilizing HIF-1 $\alpha$  and is thus a crucial determinant for glycolytic metabolism re-wiring (Palsson-298 McDermott et al., 2015). By contrast, on Day 7, M(4/13) displayed a similar level of LDH expression 299 and reduced transcription of PKM2 compared with M(-).

300 On the other hand, considering OXPHOS machinery at this time point, trained M(IFNγ/LPS) 301 showed reduced expression of the TCA cycle enzyme succinate dehydrogenase (SDH, *Sdha*), whereas 302 this downregulation was not present in M(4/13) (**Figure S4A**). Moreover, M(4/13) and M(IFNγ/LPS) 303 respectively displayed increased and decreased expression of the transcription factor 304 myelocytomatosis viral oncogene (c-Myc, *Myc*). IL-4 and IL-13 induce c-Myc expression in alternatively

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activated macrophages (L. Li et al., 2015; Luiz et al., 2020) and contrastingly LPS induced upregulation of HIF-1 $\alpha$  occurs in tandem with downregulation of c-Myc (Liu et al., 2016). Overall, without secondary stimulation, both trained M(IFN $\gamma$ /LPS) and M(4/13) retained transcriptional and metabolic profiles consistent with previous reports.

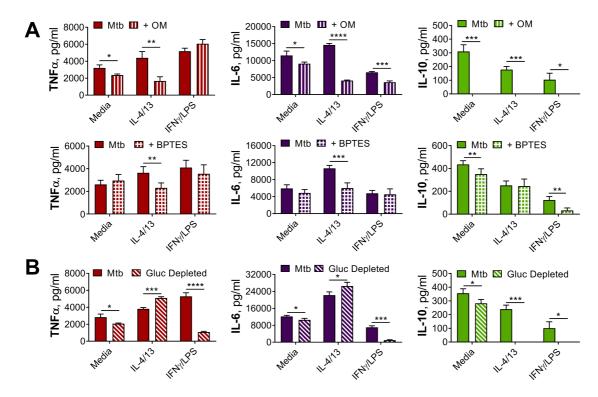
309 Upon secondary stimulation on Day 6 with either Mtb (Figure 3B) or PAM3CSK4 (Figure S4B), 310 M(IFNy/LPS) maintained the elevated expression of *Pkm2*, accompanied by reduced transcription of 311 Sdha and Myc. Myc expression was induced in untrained M(-) and M(4/13) by both secondary stimuli, 312 although Mtb did not enhance Myc in M(4/13) to the same extent as M(-). Regarding glycolytic 313 metabolism, M(4/13) displayed relatively reduced Ldha upon Mtb incubation (Figure 3B) and further 314 maintained a similar level of Sdha compared with M(-). These results indicated that trained 315 M(IFNy/LPS) and M(4/13) maintained their respective metabolic profiles following secondary stimulation with Mtb or PAM3CSK4. As such, these results indicated again that trained M(IFNy/LPS) 316 317 and M(IL-4/13) maintained their respective metabolic profiles following secondary stimulation with 318 Mtb or PAM3CSK4.

That trained M(4/13) retain OXPHOS metabolism was furthermore supported by Mtb stimulation increasing both OCR and ECAR in M(-) and M(4/13) (Figure 3C), where M(4/13) displayed significantly greater OXPHOS driven basal respiration, ATP production and concomitant proton leakage compared with M(-) (Figure 3D). In addition, in response to either Mtb (Figure 3E) or PAM3CSK4 (Figure S4C) there was an increase in spare respiratory capacity (SRC), further signifying that trained M(4/13) retain and even elevate OXPHOS metabolism following secondary stimulation with Mtb.

326 To further investigate the metabolic profile of trained M(IL-4/13) vs untrained (media control) 327 stimulated with Mtb, the relative change of intracellular metabolite abundance was furthermore 328 assessed by liquid chromatography-mass spectrometry (LC-MS, Figures 3F-G and S4D-E). This semi-329 targeted analysis revealed that the trained M(4/13) appeared to have increased use of the urea cycle, 330 as shown by reduced aspartate, arginine and argininosuccinate levels along with enhanced ornithine 331 (Figure S4E). Furthermore, there were reduced levels of metabolites associated with glycolysis and 332 the pentose phosphate pathway (PPP) – such as lactate and sedoheptulose-7-phosphate – whilst metabolites involved in fatty acid oxidation (FAO) and ATP synthesis regulation were enhanced (Figure 333 334 **3G**). In the case of FAO, reduced carnitine with enhanced carnitine-bound fatty acids (acyl carnitines) 335 signified that fatty acids were being ferried by carnitine into the mitochondrion for FAO. FAO is 336 upregulated during murine M2 macrophage activation and results in the production of acetyl-CoA, NADH and FADH<sub>2</sub>, which are further used to fuel the TCA cycle and downstream OXPHOS (O'Neill, 337 338 Kishton, & Rathmell, 2016). Furthermore, the upregulation of creatine and phosphocreatine – as well 339 as creatine biosynthesis precursor guanidinoacetate - intimated enhanced ATP synthesis. Creatine 340 reacts with ATP to form ADP and phosphocreatine, transporting ATP out of the mitochondrion and 341 preventing allosteric inhibition of ATP synthesis. In the trained M(4/13) the amount of 342 phosphocreatine per ATP was enhanced (Figure S4F), which indicated enhanced mitochondrial ATP synthesis and supported the hypothesis that OXPHOS was enhanced. Overall, these results suggested 343 344 the trained M(4/13) were upregulating their OXPHOS activity in response to mycobacterial challenge. Having observed that trained M(IL-4/IL-13) showed a distinct metabolic profile from classically 345 346 activated macrophages, the roles of glycolysis and OXPHOS in driving cytokine production were next 347 investigated with the use of inhibitors. Incubation with the glycolysis and OXPHOS inhibitor 2-deoxy 348 glucose (2-DG) (Wang et al., 2018) prior to stimulation with Mtb (Figure S5A) significantly reduced 349 TNF $\alpha$  secretion in M(IFNy/LPS) and M(-). 2-DG also reduced PAM3CSK4 induced TNF $\alpha$  in M(4/13) and 350 M(IFNy/LPS) (Figure S5B) and reduced IL-6 secretion in M(4/13) following either Mtb or PAM3CSK4 351 stimulation. Secretion of anti-inflammatory IL-10 following Mtb stimulation was also reduced by 2-DG 352 in M(IFNy/LPS) and M(4/13). This demonstrated that glycolysis, OXPHOS or both were involved in 353 driving cytokine responses to Mtb and PAM3CSK4 in all tested macrophages.

354 To further examine the role of OXPHOS, the ATP-synthase inhibitor oligomycin (OM) and the 355 glutaminase inhibitor bis-2-(5-phenylacetamido-1,3,4-thiadiazol-2-yl)ethyl sulfide (BPTES) were used prior to secondary stimulation. The role of glutaminolysis in the trained M(IL-4/13) was of interest, as 356 357 it has previously been highlighted to compensate for inhibition of glycolysis and fuel the TCA cycle 358 during IL-4 induced macrophage activation (Wang et al., 2018). In the trained M(4/13), inhibition of 359 either OXPHOS or glutaminolysis significantly reduced TNF $\alpha$  and IL-6 secretion following stimulation with either Mtb (Figure 4A) or PAM3CSK4 (Figure S5B), suggesting that both processes helped drive 360 361 pro-inflammatory responses. By contrast, in trained M(IFNy/LPS), although the markedly lower level of IL-6 was further impeded by either inhibitor, the secretion of TNF $\alpha$  was unaffected, supporting 362 363 M(IFNy/LPS) use of glycolysis to drive pro-inflammatory responses. OM and BPTES furthermore 364 impeded IL-10 secretion from M(IFNy/LPS), whereas OM reduced IL-10 secretion in M(4/13) and 365 BPTES did not (Figure 4A). In the case of trained M(4/13) this implicated that glutamine metabolism 366 was selectively a driver of pro-inflammatory cytokine responses.

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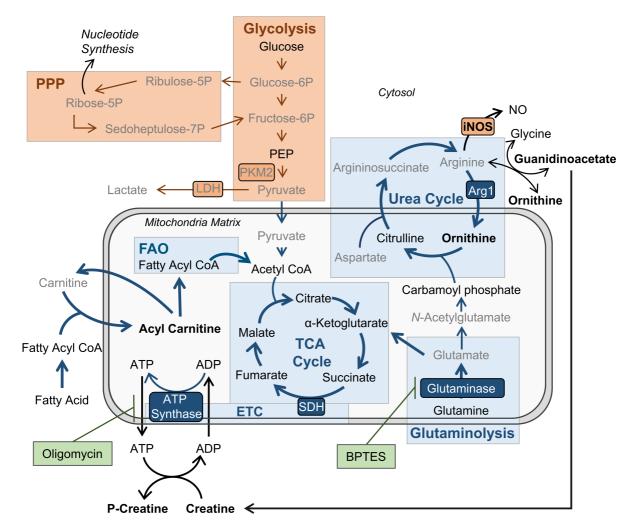
369 Figure 4. OXPHOS drives inflammatory cytokine responses in IL-4/13 trained BMDMs.

370(A) Cytokine secretion from BMDMs following incubation with media, IL-4 with IL-13 or IFNy with LPS for 24 h371on Day -1 and incubation with irradiated *M. tuberculosis* (Mtb) on Day 6 for 24 h, with or without pre-incubation372(Day 6) of oligomycin (OM) or BPTES (n = 4). (B) Cytokine secretion from BMDMs treated as in (A), with or without373glucose depleted conditions between Day -1 to 7 (n = 3). Mean ± SD are shown and analyzed by student's t-test374as indicated. \* p ≤ 0.05, \*\* p ≤ 0.01, \*\*\* p ≤ 0.001.

375

376 To further cement the differences in glycolytic metabolism between trained M(IFNy/LPS) and M(4/13), 377 an experiment was carried out where BMDMs were incubated in either glucose depleted media or 378 regular glucose-rich media from Day-1 (Figure 4B). Whereas glucose depletion significantly reduced the secretion of TNFα, IL-6 and IL-10 from M(IFNy/LPS) and M(-), following Mtb stimulation on Day 6, 379 380 glucose depletion did not impair pro-inflammatory cytokine secretion of M(4/13); instead the secretion of both TNFa and IL-6 was elevated under these conditions, whilst levels of regulatory IL-10 381 382 were further reduced, displaying an even greater shift towards pro-inflammatory responses. Furthermore, stimulation with PAM3CSK4 yielded similar results (Figure S5C), although IL-6 secretion 383 remained unaltered. This highlighted that although trained M(IFNy/LPS) and M(4/13) had similar 384 385 response profiles, M(4/13) appeared to retain M2-typical metabolism (Figure 5).

386



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Figure 5. BMDMs trained with IL-4 and IL-13 retain M2-typical metabolism: schematic summary of results.

390 Pathways have been simplified. Key: metabolic pathways strongly upregulated by M1/M2 macrophage 391 activation are highlighted by red/blue colored boxes, respectively. Inhibitors are indicated by green boxes. Arrow 392 width represents which pathways are implicated (thicker) or not (narrower) in trained M(4/13) following 393 stimulation with irradiated M. tuberculosis (Mtb). Metabolites (measured by LC-MS) or enzymes (measured by 394 qPCR) written in bold or in grey text are enhanced or reduced respectively compared with untrained 395 macrophages. Trained M(4/13) do not employ classical activated macrophage metabolism – aerobic glycolysis 396 and pentose phosphate pathway (PPP) - and instead employ alternative activated macrophage metabolism, 397 characterized by production of ATP through the tricarboxylic acid (TCA) cycle, coupled with the electron 398 transport chain (ETC) via oxidative phosphorylation (OXPHOS), as well as enhanced use of the urea cycle. 399 Glutaminolysis, FAO and ATP synthesis regulation are implicated. This is demonstrated by inhibitor experiments 400 and by changed expression of metabolites. Abbreviations: LDH, lactate dehydrogenase; NO, nitric oxide; P, 401 phosphate; PEP, Phosphoenolpyruvic acid; PKM2, pyruvate kinase M2; SDH, succinate dehydrogenase.

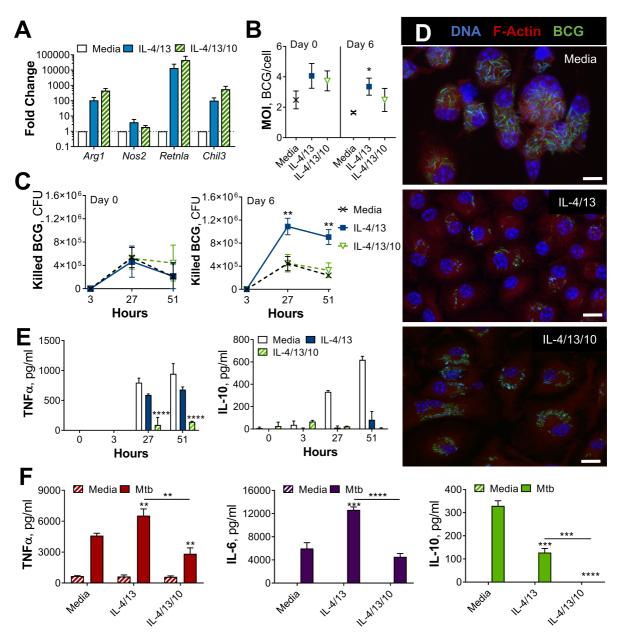
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#### 404 IL-10 Negatively Regulates IL-4 and IL-13 Induced Training

405 A key consideration regarding alternative macrophage activation and TB infection is the influence of 406 concurrent parasitic disease. Along with IL-4 and IL-13, parasites can induce production of the 407 regulatory cytokine IL-10 (Gause, Wynn, & Allen, 2013; Roy et al., 2018), which moreover promotes alternative macrophage activation (Bystrom et al., 2008; Mantovani et al., 2004). Furthermore, it has
been shown that products of the helminth *F. hepatica* can train macrophages to secrete more IL-10
following secondary LPS stimulation (Quinn et al., 2019). Given its association with alternative
macrophage activation and parasitic infection, we next considered the potential role of IL-10 in IL-4
induced macrophage innate memory responses.

413 BMDMs were activated with IL-4, IL-13 and IL-10 (M(4/13/10)) to compare how this phenotype may have differed from M(4/13). Following acute activation, M(4/13/10) had similarly 414 415 elevated levels of Arg1 as M(4/13) and a comparably minor induction of Nos2 (Figure 6A). The addition 416 of IL-10 moreover caused even greater augmentation of M2-associated Chil3 and Retnla expression. 417 Accompanying flow cytometry analysis demonstrated that both M(4/13/10) and M(4/13) exhibited reduced expression of CD80, compared with M(-), along with enhanced expression of CD206, where 418 419 the M(4/13/10) had greater CD206 expression (Figure S6A). Regarding MHC II, only M(4/13) displayed enhanced expression compared with M(-). The similar upregulation of M2-characteristic markers 420 421 indicated that M(4/13) and M(4/13/10) were two types of alternatively activated macrophages.



#### 423

424 Figure 6. IL-10 inhibits bactericidal and pro-inflammatory training induced by IL-4 and IL-13.

425 (A) qPCR of indicated mRNA in BMDMs following 24 h incubation with media or IL-4 and IL-13, with or without 426 IL-10, standardized to media control (n=4). Mean ± SD are shown. (B-E) BCG Denmark MOI (B) killing after h as 427 indicated (C) as measured by CFU per  $0.5 \times 10^6$  BMDMs on Day 0 or Day 6. Representative images of Hoechst-428 (blue), modified auramine-O- (green) and phalloidin (red)-stained BMDMs were taken on Day 6, 27 h after BCG 429 incubation (D). Cytokine secretion on Day 6, at h indicated (E). BMDMs were previously incubated with media 430 or IL-4 and IL-13, with or without IL-10, for 24 h on Day -1. (B-C, E) representative results (n = 2) are shown as 431 mean ± SD (B, E) or SEM (C) and analyzed by student's t-test compared with media (B) or multiple t-tests, with 432 Holm-Sidak correction, comparing with or without IL-10 (C, E). (F) Cytokine secretion following BMDM incubation 433 with media or IL-4 and IL-13, with or without IL-10, for 24 h on Day -1 and incubated for 24 h with media or 434 irradiated *M. tuberculosis* (Mtb) on Day 6. Mean  $\pm$  SD (n = 3) are shown and analyzed by student's t-test. \* p  $\leq$ 435 0.05, \*\* p ≤ 0.01, \*\*\*\* p ≤ 0.0001.

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A similar comparison was made at Day 7, where both M(4/13) and M(4/13/10) retained enhanced Arg1, Retnla and Chil3 expression and displayed enhanced Nos2 expression compared with naïve M(-) (Figure S6B). Regarding accompanying CD80, CD206 and MHC II expression (Figure S6C): in all tested conditions, CD206 expression was comparable between M(4/13) and M(4/13/10), whereas CD80 expression was elevated in M(4/13/10). Furthermore, M(4/13) retained an elevated expression of MHC II, which increased two- and four-fold following stimulation with Mtb and PAM3CSK4, respectively, whereas this elevation did not occur to the same degree in M(4/13/10).

447 Our next question was how the addition of IL-10 during alternative activation would affect 448 mycobacterial killing capacity. The BMDMs were incubated with roughly 30 BCG per cell on Day 0 or 449 Day 6. There were some differences in bacterial uptake, where M(4/13) took up more bacteria per cell on Day 6, leading to an MOI of 1-4 (Figure 6B). CFU counts (Figure S1C) were used to calculate killing 450 451 of internalized BCG. On Day 0, M(-), M(4/13) and M(4/13/10) displayed comparable killing capacity 452 (Figure 6C). Moreover, BCG infection did not induce detectable levels of TNF $\alpha$  or IL-10 (Figure S1D). 453 On Day 6, M(-) and M(4/13/10) maintained a similar level of BCG killing, whereas M(4/13) displayed enhanced bactericidal capacity. This indicated that IL-10 hindered the enhanced bactericidal response 454 induced by prior IL-4 and IL-13 macrophage activation. The difference in bacterial killing capacity was 455 456 further supported by confocal microscopy 27 hours after infection, where it was observed that M(-) and M(4/13/10) had markedly more bacteria per cell compared with M(4/13) (Figure 6D). 457 458 Furthermore, whereas M(4/13) showed a shift towards pro-inflammatory cytokine secretion, with IL-10 secretion being reduced whilst TNF $\alpha$  production was largely intact, M(4/13/10) secreted 459 460 significantly less TNF $\alpha$  than M(4/13), whilst IL-10 secretion was not enhanced (Figure 6E). This would indicate that IL-10 regulated the training induced by IL-4 and IL-13, preventing both the enhancement 461 462 of killing capacity and the accompanying pro-inflammatory cytokine profile.

This difference in cytokine response profile was confirmed by carrying out similar experiments 463 464 with Mtb. Whilst M(4/13), secreted lower concentrations of TNF $\alpha$ , IL-6 and IL-10 than M(-) on Day 1 465 (Figure S6D), but elevated TNF $\alpha$  and IL-6 by Day 7 (Figure 6F), while inflammatory cytokine secretion 466 by M(4/13/10) was reduced on both Day 1 and Day 7. Furthermore, whilst both M(4/13) and 467 M(4/13/10) displayed similar expression of Arg1 following Mtb stimulation on Day 7, the addition of IL-10 during activation hindered the upregulation of Nos2 observed in trained M(4/13) (Figure S6E). 468 Overall, IL-10 appeared to impede the enhanced pro-inflammatory and bactericidal capacity induced 469 by IL-4 and IL-13 innate training. 470

471

#### 473 Discussion

Although "classical" and "alternative" activation are used to describe the two extremes of 474 475 macrophage polarization, the reality is a broad spectrum of activation states, affected by a multitude 476 of signals. Moreover, growing evidence has shown that the macrophage population during M. 477 tuberculosis infection is highly heterogeneous, and thus elucidating which subtypes best contain the 478 bacterium is critical for understanding disease control (A. Khan, Singh, Hunter, & Jagannath, 2019). 479 Alternative macrophage activation is moreover relevant to TB pathology, both because alveolar 480 macrophages – the initial hosts of *M. tuberculosis* upon infection – are biased towards alternative 481 activation (Huang, Nazarova, & Russell, 2019), and also considering the influence of concurrent 482 parasitic infection. The current study shows that alternative macrophage activation stimuli impact 483 innate immune memory at least in part via epigenetic modification (Figure S3C); an additional 484 dimension to the noted diversity among macrophage populations.

485 Whilst acute alternative macrophage activation has been demonstrated to lead to reduced 486 control of *M. tuberculosis* growth (Kahnert et al., 2006), resulting in greater bacterial burden (Moreira-487 Teixeira et al., 2016; Orecchioni et al., 2019), there have been some conflicting data concerning the 488 interplay between parasites and mycobacterial infections. Parasitic infection has been shown to 489 enhance mycobacterial bacterial burden in vivo (Monin et al., 2015; Potian et al., 2011) and enhance 490 human TB pathology (Amelio et al., 2017; Mabbott, 2018), but has in some cases also been shown to 491 enhance protection against mycobacterial infection (Aira, Andersson, Singh, McKay, & Blomgran, 492 2017; O'Shea et al., 2018). Furthermore, discrepancies have been highlighted specifically regarding 493 macrophage activation. In a model of *M. tuberculosis* macrophage infection *in vitro*, prior incubation 494 (48hr) with antigens from Hymenolepis diminuta, Trichuris muris and Schistosoma mansoni resulted 495 in alternative macrophage activation, but only incubation with the *H. diminuta* and *T. muris* antigens 496 resulted in enhanced mycobacterial growth (Aira et al., 2017). Moreover, the increased growth was 497 accompanied by enhanced secretion of IL-10. This however was not surprising, given that IL-10 has 498 been demonstrated to prevent phagolysosome maturation in human macrophages (O'Leary et al., 499 2011) and promote TB disease progression in mice (Beamer et al., 2008). Herein, an additional 500 mechanism is proposed, as IL-10 appears to be a key determinant of alternative macrophage training 501 and subsequent control of mycobacterial challenge. BMDM activation with IL-4 and IL-13, with or 502 without the addition of IL-10, resulted in similar activation states: comparable expression of Arg1, 503 Retnla and Chil3 on Day 0 (Figure 6A) and 7 (Figure S6B), reduced expression of CD80 and upregulation 504 of CD206 on Day 0 (Figure S6A), as well as reduced secretion of cytokines TNF $\alpha$ , IL-6 and IL-10 505 following stimulation with Mtb on Day 0 (Figure S6D). Whilst this hyporesponsive profile was 506 maintained in the M(4/13/10), the trained M(4/13) on the other hand demonstrate enhanced proinflammatory and bactericidal mechanisms in response to mycobacterial challenge a week after initial
activation (Figure 6). This intimated that IL-10 was a negative regulator of innate training induced by
IL-4 and IL-13 and supports that distinct cytokine mediated modes of alternative macrophage
activation differ regarding their innate memory programming.

The trained M(4/13) in response to mycobacterial challenge adopted a phenotype similar to 511 512 classically activated BMDMs: a skewing towards pro-inflammatory cytokine secretion with concomitant increased expression of Nos2 and NO production (Figure 2), as well as enhanced 513 514 mycobacterial killing capacity (Figure 1). Classical macrophage activation is intrinsically linked with a glycolytic shift in metabolism; it is thus not surprising that prior work has identified an enhancement 515 of glycolysis as critical for efficient *M. tuberculosis* killing (Gleeson et al., 2016; Huang et al., 2018) and 516 517 that impeding glycolysis attenuates macrophages ability to control TB infection (Hackett et al., 2020). 518 Moreover, upon *M. tuberculosis* infection, macrophages appear to undergo a biphasic metabolic 519 profile, where they switch from an initial increase in glycolytic metabolism to an enhancement of the 520 TCA cycle and OXPHOS; a switch which allows mycobacterial survival and disease progression (Shi et 521 al., 2019). As such, it was expected that the trained M(4/13) would shift towards glycolytic 522 metabolism. However, this was not the case, as Mtb stimulation resulted in enhanced OCR and SRC, 523 indicating the use and upregulation of OXPHOS (Figure 3). Furthermore, LC-MS analysis of metabolites indicated increased use of FAO, as well as enhanced creatine, further supporting the continued use of 524 525 M2-typical metabolism. This was moreover confirmed with the use of the ATP synthase inhibitor 526 oligomycin, where it was demonstrated that inhibition of OXPHOS reduced trained M(4/13) cytokine 527 secretion, whereas by contrast M(IFNy/LPS) TNF $\alpha$  upregulation was unaffected. Furthermore, when 528 trained M(4/13) were incubated in a glucose depleted environment during the week preceding 529 secondary stimulation, the glucose depletion enhanced the pro-inflammatory shift: increased TNF $\alpha$ and IL-6 secretion combined with reduced IL-10 production (Figure 4B). This was a stark contrast to 530 531 the effect of glucose depletion on untrained M(-) and trained M(IFNy/LPS), where the secretion of all measured cytokines was attenuated. This contrast between M(4/13) and M(IFNy/LPS) cemented their 532 533 differences regarding metabolic dependency on glucose.

It is of note that the addition of a glycolysis inhibitor reduced cytokine secretion, from M(-), M(IFNy/LPS), as well as M(4/13) following secondary stimulation (**Figures S5A-B**). That inhibition of glycolysis impeded pro-inflammatory cytokine secretion, but glucose depletion did not, indicated that glycolysis in trained M(4/13) was fueling the TCA cycle and downstream OXPHOS, and upon glucose depletion other pathways, such as glutaminolysis, were compensating for this loss. Glutaminolysis has been shown to be upregulated following macrophage activation with IL-4 and has been demonstrated to compensate for glycolysis inhibition in driving the TCA cycle and OXPHOS (Wang et al., 2018). In the 541 present study, it was moreover observed that the use of a glutaminolysis inhibitor reduced TNF $\alpha$  and 542 IL-6 secretion following secondary stimulation in trained M(4/13) specifically, and not in untrained M(-) or M(IFNy/LPS) (Figure 4A). It should be noted that prior work has identified differences in 543 544 macrophage metabolic profiles in response to infection with live *M. tuberculosis* compared with the 545 killed bacterium or infection with attenuated BCG (Cumming, Addicott, Adamson, & Steyn, 2018). 546 However, the consensus is that classic macrophage activation, and an accompanying shift to glycolytic metabolism, is paramount for effective mycobacterial killing and propagation of inflammatory 547 548 responses. It is surprising therefore that these results summarily intimated that trained M(4/13)549 maintain OXPHOS to fuel anti-mycobacterial responses.

550 The metabolic profile in trained M(4/13), as summarized in **Figure 5**, is not only distinct from 551 classically activated macrophages, but also from that seen with other training stimuli, such as  $\beta$ -glucan. 552 Innate training is being tested as a means to bolster innate immunity against *M. tuberculosis* (Khader 553 et al., 2019) and it was recently reported that training with  $\beta$ -glucan was protective against subsequent 554 *M tuberculosis* infection, as seen by enhanced human monocyte pro-inflammatory cytokine secretion and increased mouse survival in vivo (Moorlag et al., 2020). Similar to classical macrophage activation, 555  $\beta$ -glucan training results in a glycolytic shift, as demonstrated in human monocytes (Cheng et al., 556 557 2014). As such, the phenotype of the trained M(4/13) is distinct from other macrophage phenotypes previously demonstrated to protect against TB, and thus offers an additional avenue for future 558 559 research regarding strategies for combatting this disease.

Van den Bossche et al. in 2016 highlighted a key adaptive distinction between classical and alternative macrophage activation: that alternatively activated macrophages can be "re-polarized" due to their metabolic versatility, whereas the mitochondrial dysfunction which occurs during classical macrophage activation prevents such reprogramming (Van den Bossche et al., 2016). In the current study, an additional adaptive capacity is identified: that activation with IL-4 and IL-13 programs BMDMs to better respond to a mycobacterial challenge, whilst crucially retaining their metabolic diversity.

In conclusion, our work presents mechanistic insight into how innate training via IL-4 and IL13 can enhance macrophage pro-inflammatory responses and mycobacterial killing. This unexpected
finding shows how macrophage plasticity belies the usual M1-M2 dichotomy and provides a new
framework to explore the impact of comorbidities, such as parasitic infections, on TB disease burden.

572

# 573 Materials and Methods

# 574 Table 1. Sources of materials and resources

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
	Thermo Fisher	Cat# 47-0112-82,
Anti-CD11b-APC-eFluor 780	Scientific, Waltham,	RRID: AB_1603193,
	Massachusetts	Clone M1/70
Anti-CD206-PE	BioLegend, San Diego, California	Cat# 141706, RRID: AB_10895754, Clone C068C2
Anti-CD80-FITC	BD Biosciences, Franklin Lakes, New	Cat# 561954, RRID: AB_10896321, Clone
		16-10A1
	Jersey Thermo Fisher	
Anti-F4/80-PerCP-Cy5.5		Cat# 45-4801-82,
	Scientific, Waltham, Massachusetts	RRID: AB_914345, Clone BM8
Anti-MHC class II-eFlour 450	Thermo Fisher	Cat# 48-5321-82,
Anti-Wite class in-eriour 450	Scientific, Waltham,	RRID: AB_1272204,
	Massachusetts	Clone M5/114.15.2
Fablack Anti CD16/CD22	BD Biosciences,	Cat# 553142, RRID:
Fc block: Anti-CD16/CD32	Franklin Lakes, New	AB_394657, Clone
	Jersey	2.4G2
Bacterial and virus strains		
Non-viable irradiated Mycobacterium tuberculosis	BEI resources,	NR-49098
strain H37Rv	Manassas, Virginia	
Bacille Calmette-Guérin (BCG) Denmark 1331	Gift to Prof. Gordon	N/A
	from Prof. Behr,	
	McGill University,	
	Canada	
Chemicals, peptides, and recombinant proteins		
	Sigma Aldrich,	
2-deoxyglucose, 2-DG	Burlington,	Cat# D8375
	Massachusetts	
	Santa Cruz	
4% PFA in PBS	Biotechnology, Dallas,	Cat# NC0238527
······································	Texas	
	Thermo Fisher	
Acetonitrile	Scientific, Waltham,	Cat# 10001334
	Massachusetts	Cuth 10001007
	Sigma Aldrich,	
Antimucin-A	-	Cat# A8674
Antimycin-A	Burlington, Massachusetts	Cal# A00/4
	wassachusetts	

	Sigma Aldrich,		
BPTES	Burlington,	Cat# SML0601-5mg	
	Massachusetts		
	InvivoGen, San Diego,		
CpG	California	Cat# ODN M362	
	Sigma Aldrich,		
DMEM (high glucose)	Burlington,	Cat# D5671	
	Massachusetts		
	Gibco, Waltham,		
DMEM (no glucose)	Massachusetts	Cat# 11966025	
	Meridian Bioscience,		
dNTP Mix	Cincinnati, Ohio	Cat# BIO-39028	
	Biosera,		
FBS	Kansas City, Missouri	Batch# 015BS551	
	Sigma Aldrich,		
FCCP	Burlington,	Cat# C2920	
	Massachusetts		
	Invitrogen, Waltham,		
Fixable Viability Stain 510	Massachusetts	Cat# 564406	
	Sigma Aldrich,		
Glucose	Burlington,	Cat# G8270	
	Massachusetts		
	Gibco, Waltham,		
L-Glutamine	Massachusetts	Cat# 25030-024	
	Sigma Aldrich,		
Glycerol	Burlington,	Cat# G2025	
	Massachusetts		
	Thermo Fisher		
Heat-Shocked Bovine Serum Albumin (BSA)	Scientific, Waltham,	Cat# 12881630	
	Massachusetts		
	Thermo Fisher		
Hoechst 33342	Scientific, Waltham,	Cat# 10150888	
	Massachusetts		
	Sigma Aldrich,		
KAPA SYBR <sup>®</sup> FAST Rox low qPCR Kit Master Mix	Burlington,	Cat# KK4622	
	Massachusetts		
	Enzo, Farmingdale,	Cat# ALX-581-007-	
LPS, <i>Escherichia coli</i> , serotype R515	New York	L002	
	Thermo Fisher		
Methanol	Scientific, Waltham,	Cat# 10284580	
	Massachusetts		
	Sigma Aldrich,		
Middlebrook 7H11 powder	Burlington,	Cat# M0428	
	- ·		
· · · · · · · · · · · · · · · · · · ·	Massachusetts		

	Sigma Aldrich,		
Middlebrook 7H9 powder	Burlington,	Cat# M0178	
·	Massachusetts		
	Promega, Madison,		
M-MLV reverse transcriptase	Wisconsin	Cat# M3683	
	Scientific Device		
Modified Auramine-O stain and quencher	Laboratory, Des	Cat# 345-04L	
	Plaines, Illinois		
	Sigma Aldrich,		
MTA	Burlington,	Cat# D5011-25MG	
	Massachusetts		
	Sigma Aldrich,		
Oligomycin	Burlington,	Cat# 75351	
ongomycm	Massachusetts		
PAM3CSK4	InvivoGen, San Diego, California	Cat# tlrl-pms	
PBS, sterile	Gibco, Waltham, Massachusetts	Cat# 14190094	
Penicillin-Streptomycin	Gibco, Waltham,	Cat# 15-070-063	
	Massachusetts		
Phalloidin-Alexa Fluor 647	Invitrogen, Waltham,	Cat# A22287	
	Massachusetts		
Poly I:C	InvivoGen, San Diego,	Cat# tlrl-pic	
-, -	California		
	Sigma Aldrich,		
Pyruvate	Burlington,	Cat# P5280	
	Massachusetts		
	Sigma Aldrich,		
Radio-Immunoprecipitation Assay (RIPA) buffer	Burlington,	Cat# R0278-50ML	
	Massachusetts		
Random Hexamer Primer Mix	Meridian Bioscience,	Cat# BIO-38028	
	Cincinnati, Ohio	Cal# DIO-36026	
	Peprotech, Cranbury,	0.1/1 245 05	
Recombinant murine IFNy	New Jersey	Cat# 315-05	
	Peprotech, Cranbury,	-	
Recombinant murine IL-10	New Jersey	Cat# 210-10	
	Peprotech, Cranbury,		
Recombinant murine IL-13	New Jersey	Cat# 210-13	
	Peprotech, Cranbury,		
Recombinant murine IL-4	New Jersey	Cat# 214-14	
	InvivoGen, San Diego,	+	
Resiquimod/R848	California	Cat# tlrl-r848	
Reverse Transcriptase Buffer	Promega, Madison,	Cat# A3561	
	Wisconsin		

RNAseOUT	Invitrogen, Waltham, Massachusetts	Cat# 10777019		
Rotenone	Sigma Aldrich, Burlington, Massachusetts	Cat# R8875		
Seahorse Calibration Fluid pH 7.4	Agilent.			
Seahorse XF DMEM Medium	Agilent, Santa Clara, California	Cat# 103575-100		
Sodium Chloride	Sigma Aldrich,			
Tween20	Sigma Aldrich, Burlington, Massachusetts			
Valine-d8	CK isotopes, Newtown Unthank, UK	Cat# DLM-488		
Vectashield mounting media	VWR, Vector Laboratories	Cat# 101098-042		
/ater, sterile Baxter, Deerfield, Illinois		Cat# UKF7114		
Critical commercial assays				
BCA Protein Assay Kit (Pierce™)	Protein Assay Kit (Pierce™) Thermo Fisher Massachusetts			
Griess Reagent System kit	Promega, Madison, Wisconsin	Cat# G2930		
High Pure RNA Isolation Kit	Roche, Basel, Switzerland	Cat# 11828665001		
Mouse IL-10 ELISA MAX	BioLegend, San Diego, California	Cat# 431411		
Mouse IL-6 ELISA MAX	BioLegend, San Diego, California	Cat# 431301		
R&D Systems,Duse TNFα DuoSet ELISAMinneapolis,MinnesotaMinnesota		Cat# DY410		
Deposited data				
Raw and analyzed data	This Paper	DOI: 10.17632/ncbph43 m85.1.		

L929	gift of Dr. Muñoz- Wolf, Trinity College, Dublin	N/A	
Experimental models: Organisms/strains			
WT mice used for cell isolations	In-house colonies	C57BL/6JOlaHsd	
Oligonucleotides			
Primers for Actb	See Table S1	N/A	
Primers for Arg1	See Table S1	N/A	
Primers for Chitl3	See Table S1	N/A	
Primers for Ldha	See Table S1	N/A	
Primers for Myc	See Table S1	N/A	
Primers for Nos2	See Table S1	N/A	
Primers for Pkm2	See Table S1	N/A	
Primers for <i>Retnla</i>	See Table S1	N/A	
Primers for Sdha	See Table S1	N/A	
Primers for Tbp	See Table S1	N/A	
Software and algorithms			
FlowJo 7	FlowJo LLC, Franklin Lakes, New Jersey	https://www.flowjo. com/solutions/flowj o	
MetaboAnalyst 5.0	Xia Lab @ McGill	https://www.metab oanalyst.ca/	
Microsoft Office Excel	Microsoft, Redmond, Washington	https://products.offi ce.com/en-au/excel	
Prism 8.2	GraphPad Software, San Diego, California	https://www.graphp ad.com/scientific- software/prism/	
Tracefinder 5.0	Thermo Fisher Scientific, Waltham, Massachusetts	https://www.therm ofisher.com/ie/en/h ome/industrial/mass - spectrometry/liquid- chromatography- mass-spectrometry- lc-ms/lc-ms- software/lc-ms- data-acquisition- software/tracefinder -software.html	

### 576 Experimental Model and Subject Details

#### 577 Animals

578 Mice used for primary cell isolation were eight to 16-week-old wild-type C57BL/6 mice that were bred

- 579 in the Trinity Biomedical Sciences Institute Bioresources Unit. Animals were maintained according to
- 580 the regulations of the Health Products Regulatory Authority (HPRA). Animal studies were approved by
- the TCD Animal Research Ethics Committee (Ethical Approval Number 091210) and were performed
- 582 under the appropriate license (AE191364/P079).

#### 583 Cell Isolation and Culture

Bone marrow-derived macrophages (BMDMs) were generated as described previously by our 584 group.(Lebre, Hanlon, Boland, Coleman, & Lavelle, 2018) Briefly, bone marrow cells were extracted 585 586 from the leg bones and were cultured in high glucose DMEM, supplemented with 8% v/v fetal bovine serum (FBS), 2 mM L-glutamine, 50 U ml<sup>-1</sup> penicillin, 50 µg ml<sup>-1</sup> streptomycin (hereafter referred to as 587 588 complete DMEM [cDMEM]). Cells were plated on non-tissue cultured treated petri dishes (Corning) 589 and supplemented with 25% v/v of L929 cell line conditioned medium containing macrophage colony-590 stimulating factor (M-CSF) on day -8. Fresh medium was added on day -5 and on day -2 adherent cells 591 were detached by trypsinization and collected. Unless specified otherwise, for acute/polarization studies, BMDMs were seeded in 12-well plates at  $0.9 \times 10^6$  BMDMs per well, and for training studies, 592 593 BMDMs were seeded in 24-well plates at  $0.2 \times 10^6$  BMDMs per well.

On day -1 BMDMs were cultured with medium (naïve/untrained) or activated with 25 ng ml<sup>-1</sup> IFNy with 594 10 ng ml<sup>-1</sup> LPS (classical activation), or 40 ng ml<sup>-1</sup> IL-4 with 20 ng ml<sup>-1</sup> IL-13, with or without 40 ng ml<sup>-1</sup> 595 596 IL-10 (alternative activation) - all included 15% L929 conditioned media. After 24 hours, the supernatant was replaced with fresh media (with 10% L929 conditioned media). For acute 597 598 activation/polarization studies, the BMDMs were left to rest for 2 hours before experiment. For 599 training studies, the BMDMs were left to rest, fed on day 3 (media supplemented with 7% L929 600 conditioned media) and experiments were carried out on day 6. The amount of L929 conditioned 601 media added on each day was consistent for all experiments.

#### 602 BCG Infection

603 Mature BMDMs were seeded in 24-well plates at  $0.5 \times 10^6$  cells (acute activation) or  $0.2 \times 10^6$  cells 604 (training) per well on day -2. For imaging of internalized BCG in untrained and trained BMDMs,  $0.2 \times$ 605  $10^6$  BMDMs were seeded on circular glass coverslips (placed in 24 well plates, one coverslip per well) 606 that had been previously treated with sodium hydroxide to aid attachment.

607 BMDMs were incubated with media (naïve) or activated as outlined above on day -1, for 24 608 hours before BMDMs were washed and fresh media was added. For acute activation studies, BMDMs were infected with BCG Denmark minimum 3 hours later. For training studies, BMDMs were fed onday 3 and infected with BCG Denmark on Day 6.

611Regarding infection dose (BCG per cell), for infection in acutely activated BMDMs, cell number612per well was assumed to be  $0.5 \times 10^6$ . For infecting trained BMDMs, three extra wells were prepared613for all conditions and BMDMs were removed from these wells by trypsinization on day 5, pooled and614counted in triplicate. Prepared BCG single cell suspension (see below) was diluted to reach an intended615infection dose of 5 BCG per cell (as measured by  $OD_{600}$ , where 0.1 is estimated to be  $10 \times 10^6$  bacteria616ml<sup>-1</sup>). Each infection dose was measured via CFU counts (see below) and was thus subsequently617corrected to an actual infection dose of roughly 30 BCG per cell.

618 3 hours post infection the supernatant was removed and the infected BMDMs were washed
619 twice with Dulbecco's Phosphate Buffered Saline (PBS) to remove extracellular bacteria, and fresh
620 media was added.

To measure cytokine secretion at each time point (3-, 27- and 51 hours post infection),
 supernatant was collected and filtered (polyethersulfone [PES] 0.22 μm Luer lock syringe filter; Millex GP) to remove BCG, prior to specific cytokines being measured by ELISA.

For CFU counts, at each time point the media was removed, wells were washed once with PBS
before the BMDMs were lysed with 0.05% Tween20 in water. The cell lysate was diluted in prewarmed (37 °C) 7H9 media, and 50 µl of dilutions 10<sup>-2</sup>-10<sup>-6</sup> were spread onto enriched 7H11 agar plates
by dotting. Agar plates were incubated at 37 °C for 6 weeks and colonies were counted once a week
from week 2 and on. CFU counts 3 hours gave the multiplicity of infection (MOI).

For imaging internalized BCG (wells containing glass coverslips), media was removed, BMDMs were washed with PBS and then fixed with 4% paraformaldehyde (in PBS) overnight. The paraformaldehyde was then removed and coverslips were stored in PBS.

632

#### 633 Stimulation Experiments

Naïve (media control) or activated BMDMs were incubated with media or secondary stimuli on day 0
(acute activation/polarization) or day 6 (training). Secondary stimuli: 150 µg ml<sup>-1</sup> gamma-irradiated
whole cells of *Mycobacterium tuberculosis* strain H37Rv (concentration measured by OD<sub>600</sub>, where 100
mg ml<sup>-1</sup> was 0.32), 35 ng ml<sup>-1</sup> PAM3CSK4, 25 ng ml<sup>-1</sup> LPS, 5 µg ml<sup>-1</sup> Poly I:C, 0.55 µg ml<sup>-1</sup> R848, 10 µg ml<sup>-</sup>
<sup>1</sup> CpG.

639 For histone methylation inhibition: on day -2 BMDMs were incubated with MTA (final 640 concentration 1 mM) one hour prior to media incubation or activation as outlined above.

641 For metabolic inhibition experiments: on day 6 BMDMs were pre-incubated with 1mM 2-DG 642 for 3 hours, 2  $\mu$ M oligomycin or 10  $\mu$ M BPTES 1 hour prior to media incubation or secondary 643 stimulation.

For glucose depletion training experiment: untrained or trained BMDMs were incubated with either the regular high glucose cDMEM or glucose depleted cDMEM, with DMEM devoid of glucose (Gibco), from day -2 until incubation with media or secondary stimulation on Day 6 (fed day 3 with the same media as given on day -2). Note, the glucose depleted cDMEM included 8% v/v FBS and the same amount of L929 conditioned media as outlined previously, both of which provided a source of glucose.

#### 649 Seahorse

All real-time measurements of oxygen consumption rate (OCR) and extracellular acidification rate
(ECAR) were measured by using Seahorse system: Seahorse XFe96 Analyzer (Agilent). The analysis
used was a Mitochondrial Stress Test (using a standard Agilent Seahorse protocol).

On day -2, mature BMDMs were seeded in a 96-well Seahorse plate (Agilent): 100,000 cells per well for acute activation studies or 30,000 cells per well for training studies. BMDMs were activated on day -1 as outlined and analyzed on either day 0 (24 hours after activation) or day 6 (fed on day 3), with or without secondary stimulation on day 5 (training studies).

The day before analysis, a Seahorse Cartridge (Agilent) was incubated overnight at 37 °C (incubator devoid of CO<sub>2</sub>). The following day, the sterile water was replaced with Calibration Fluid at pH 7.4 incubated as before for 90 minutes before the analysis.

An hour before the analysis, in the Seahorse plate regular cDMEM was replaced with Seahorse
XF DMEM, supplemented with 10 mM glucose, 1 mM pyruvate and 2 mM L-glutamine. The BMDMs
were then incubated for an hour at 37 °C (incubator devoid of CO<sub>2</sub>).

663 15 minutes before the analysis, the cartridge was removed and reagents/inhibitors were 664 added to their respective ports: oligomycin (port A, final concentration 10  $\mu$ M), FCCP (port B, final 665 concentration 10  $\mu$ M), rotenone and antimycin-A (port C, final concentrations 5  $\mu$ M each).

The analysis was carried out according to the manufacturer's instructions. Recorded valuesless than zero were disregarded.

For training experiments, protein concentration was used to standardize the OCR and ECAR measurements. Supernatant was removed, cells were washed once in PBS and 10  $\mu$ l of RIPA buffer was added per well. After pipetting up and down and scraping, the buffer was collected and samples from the same condition were pooled. 20  $\mu$ l of pooled solution was used to measure protein concentration, using the Pierce bicinchoninic acid (BCA) assay kit (Thermo Scientific) according to the manufacturer's instructions (microplate procedure). Absorbance was measured at 560 nm.

#### 674 Metabolomics (LC-MS) sample preparation

On day -2, BMDMs were seeded in 6-well plates:  $1 \times 10^6$  cells/well and activated on day -1 with IL-675 676 4/13 as outlined or incubated with media. BMDMs were fed on day 3 and incubated with irradiated 677 *M. tuberculosis* on Day 6 for 24 hours. Prior to metabolite extraction, cells were counted using a 678 separate counting plate prepared in parallel and treated exactly like the experimental plate. 679 Supernatant was removed and cells were washed once in PBS. After aspiration, the BMDMs were kept 680 at -80 °C or on dry ice. Metabolites were extracted by adding chilled extraction buffer (500  $\mu$ l/1  $\times$  10<sup>6</sup> cells), followed by scraping (carried out on dry ice). Buffer was transferred to chilled eppendorf tubes 681 682 and shaken in a thermomixer at maximum speed (2000 rpm) for 15 minutes at 4 °C. Following centrifugation at maximum speed for 20 minutes, roughly 80% of supernatant was transferred into 683 684 labelled LC-MS vials, taking care to avoid pellet and any solid debris.

#### 685 Flow Cytometry

686 On day -2,  $0.8 \times 10^6$  mature BMDMs were seeded on non-tissue cultured treated 35 mm petri dishes 687 (Corning) and activated as previously outlined on Day -1. The naïve or activated/trained BMDMs were 688 harvested at two separate time points: day 0 (24 hours post activation for acute activation 689 characterisation) or day 6 (fed on day 3), with or without secondary stimulation on day 5 as specified 690 in figure legends (training experiments).

For analysis, BMDMs were placed on ice for 30 min before harvesting with PBS-EDTA (5 mM) solution by gently pipetting up and down and transferring to flow cytometry tubes. Cells were incubated with Fixable Viability Stain 510 at RT for 15 min. After washing with PBS, cells were stained with anti-mouse Fc block, 15 minutes prior staining with CD80-FITC, CD206-PE, F4/80-PerCP-Cy5.5, CD11b-APC-eFluor 780, MHC class II-eFluor 450 for an additional 30 min at 4 °C. The cells were washed with PBS and resuspended in flow cytometry buffer (1% FBS in PBS). Samples were acquired on a BD Canto II flow cytometer and the data was analysed by using FlowJo software.

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#### 699 Method Details

#### 700 BCG Preparation and Plating

Bacille Calmette-Guérin (BCG) Denmark (OD<sub>600</sub> 0.1) was incubated in 7H9 media at 37 °C with rotation
 until the OD<sub>600</sub> 0.5-0.8 (logarithmic growth phase) was reached.

Single cell suspension was prepared as follows: bacteria were pelleted by centrifugation and 704 7H9 media was removed. Bacteria were vortexed with glass beads before pre-warmed (37 °C) DMEM 705 was added and bacteria were left to sediment for 5 minutes. Bacterial suspension was carefully 706 collected (avoiding disruption of the pellet) and centrifuged again to pellet large clumps. Suspension

707 was collected (avoiding the pellet). Suspension was passed through a 26G needle 15 times to708 disaggregate bacterial clumps.

Bacterial concentration was estimated by  $OD_{600}$  (where 0.1 was estimated as  $10 \times 10^6$  bacteria ml<sup>-1</sup>) and infection dose was confirmed by colony forming unit (CFU) counts.

711 7H11 agar plates (for CFU counts) were made up as follows: 10.5 g middlebrook 7H11 powder
712 and 2.5 ml glycerol was dissolved in distilled water to reach 500 ml and autoclaved. Once cooled
713 sufficiently, 50 ml sterile-filtered (0.22 µm; SteriCup [Millipore]) albumin-dextrose-sodium chloride
714 (ADN) enrichment was added. For 1 liter of ADN enrichment: 50 g fatty acid-free, heat-shocked bovine
715 serum albumin, 8.5 g sodium chloride and 20 g glucose were dissolved in sterile water to reach 1 liter.
716

#### 717 Staining and Imaging of Internalized BCG

718 For staining the coverslips contained in 24-well plates, PBS was removed and 17 µM Hoechst 33342 719 and 7.5 U Phalloidin-Alexa Fluor 647 (in 1 ml PBS) was added to each well. After half an hour (in the 720 dark), the solution was removed and the coverslips were washed with PBS. 200 µl Modified Auramine-721 O stain was added for 2 minutes (in the dark), after which the stain was removed and the wells were 722 washed with PBS. To guench any extracellular BCG, 200 µl Auramine-O Quencher de-colorizer was 723 added for 2 minutes (in the dark) and then the quencher was removed and the coverslips were washed 724 with PBS. The coverslips were then fixed onto glass slides: 2 µl Vectashield mounting media was used 725 per coverslip and clear nail polish was applied around the edge and allowed to dry completely. The 726 coverslips were stained and imaged the same day.

Images of all samples were obtained using a Leica SP8 confocal microscope, taken with x40
 magnification oil objective. Z-stack images through the entire cell were obtained and representative
 images were taken from these stacks.

#### 730 Liquid Chromatography coupled to Mass Spectrometry (LC-MS)

731 Extraction buffer for isolating metabolites: 50% LC-MS grade methanol, 30% LC-MS grade acetonitrile,

732 20% ultrapure water (internal filtration system), valine-d8 final concentration 5  $\mu$ M.

733 Hydrophilic interaction chromatographic (HILIC) separation of metabolites was achieved using 734 a Millipore Sequant ZIC-pHILIC analytical column (5  $\mu$ m, 2.1 × 150 mm) equipped with a 2.1 × 20 mm guard column (both 5 mm particle size) with a binary solvent system. Solvent A was 20 mM ammonium 735 736 carbonate, 0.05% ammonium hydroxide; Solvent B was acetonitrile. The column oven and 737 autosampler tray were held at 40 °C and 4 °C, respectively. The chromatographic gradient was run at 738 a flow rate of 0.200 mL/min as follows: 0–2 min: 80% B; 2-17 min: linear gradient from 80% B to 20% B; 17-17.1 min: linear gradient from 20% B to 80% B; 17.1-22.5 min: hold at 80% B. Samples were 739 740 randomized and analysed with LC–MS in a blinded manner with an injection volume was 5 µl. Pooled samples were generated from an equal mixture of all individual samples and analysed interspersed at
 regular intervals within sample sequence as a quality control.

743 Metabolites were measured with a Thermo Scientific Q Exactive Hybrid Quadrupole-Orbitrap 744 Mass spectrometer (HRMS) coupled to a Dionex Ultimate 3000 UHPLC. The mass spectrometer was 745 operated in full-scan, polarity-switching mode, with the spray voltage set to +4.5 kV/-3.5 kV, the 746 heated capillary held at 320 °C, and the auxiliary gas heater held at 280 °C. The sheath gas flow was 747 set to 25 units, the auxiliary gas flow was set to 15 units, and the sweep gas flow was set to 0 unit. 748 HRMS data acquisition was performed in a range of m/z = 70-900, with the resolution set at 70,000, 749 the AGC target at  $1 \times 10^6$ , and the maximum injection time (Max IT) at 120 ms. Metabolite identities 750 were confirmed using two parameters: (1) precursor ion m/z was matched within 5 ppm of theoretical 751 mass predicted by the chemical formula; (2) the retention time of metabolites was within 5% of the 752 retention time of a purified standard run with the same chromatographic method. Chromatogram 753 review and peak area integration were performed using the Thermo Fisher software Tracefinder 5.0 754 and the peak area for each detected metabolite was normalized against the total ion count (TIC) of that sample to correct any variations introduced from sample handling through instrument analysis. 755 756 The normalized areas were used as variables for further statistical data analysis.

#### 757 ELISA

For detection of secreted TNFα, IL-6 and IL-10 from BMDMs, supernatants were collected and
cytokines quantified by ELISA according to manufacturers' instructions (R&D Systems or Biolegend),
except antibody and sample volumes were halved.

#### 761 Nitric oxide (NO) secretion

NO concentrations were quantified by indirect measurement of nitrite (NO<sub>2</sub><sup>-</sup>) via the Griess Reagent
System kit (Promega). The assay was carried out as per manufacturer's instructions and absorbance
of 560 nm was measured.

#### 765 Reverse Transcription Quantitative PCR (rt-qPCR)

RNA was isolated via High Pure RNA Isolation Kit (Roche) according to the manufacturer's instructions and RNA was eluted in 50 µl water. RNA (minimum 100 ng) was reverse transcribed into complementary DNA (cDNA) with an M-MLV reverse transcriptase, RNase H minus, point mutant, in reverse transcriptase buffer, mixed with dNTPs, random hexamer primers and ribonuclease inhibitor (RNAseOUT). Quantitative PCR was performed using KAPA SYBR® FAST Rox low qPCR Kit Master Mix in accordance with the instructions provided by the manufacturer, using QuantStudio 3 System technology. Primers (Table S1) were designed in Primer BLAST and/or were also checked in Primer BLAST for specificity to the gene of interest. Where possible, primers were chosen to cross an exon-exon junction.

775RNA expression was normalized to the internal references β-actin and/or TATAbox-binding776protein, from the corresponding sample ( $Ct_{gene}$ - $Ct_{reference}$ = $\Delta Ct$ ). Furthermore,  $\Delta Ct$  from control samples777were subtracted from the  $\Delta Ct$  of each sample ( $\Delta Ct_{treatment}$ - $\Delta Ct_{ctrl}$  = $\Delta \Delta Ct_{treatment}$ ). Fold change was778calculated as 2<sup>(- $\Delta \Delta Ct$ )</sup>. These calculations were carried out using Microsoft Excel.

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- 780 781

#### 782 Quantification and Statistical Analysis

Data were evaluated on either on Prism version 8 for Windows or via R for Metaboanalyst generated
analysis. Differences between two independent groups were compared via unpaired Student's t-test.
For BCG infection studies where two independent groups were compared at several time points,
multiple t-test analysis was employed, with Holm-Sidak correction for multiple comparisons.
Differences were considered significant at the values of \* P < 0.05, \*\* P < 0.01, \*\*\* P < 0.001 and \*\*\*\*</li>

- 788 P < 0.0001.
- 789 Data and Code Availability
- All data is available at Mendeley Data DOI: 10.17632/ncbph43m85.1.
- 791

### 792 Acknowledgements

793 The authors would like to thank Dr Gavin McManus for his assistance with the imaging studies.

M. Lundahl was funded by a Trinity College Dublin postgraduate studentship and this work is
supported by Science Foundation Ireland (SFI) Research Centre, Advanced Materials and
BioEngineering Research (AMBER) under Grant number 12/RC/2278\_P2 E, SFI under Grant number
12/IA/1421 and 19FFP/6484 (E. Lavelle) and SFI under Grant number 15/CDA/3310 (E. Scanlan). S.
Gordon and M. Mitermite acknowledge funding from Wellcome Trust PhD Studentship
109166/Z/15/A and SFI award 15/IA/3154.

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### 801 Author Contributions

M.L.E.L. performed and analyzed all experiments and wrote the paper. M.M., B.S. and S.V.G provided
 assistance with BCG infection studies. D.G.R, N.C.W. and L.A.J.O. assisted with Seahorse experiments.
 M.Y. identified and quantified the metabolites via LC-MS and D.G.R and C.F. assisted with

- 805 metabolomics analysis. M.L.E.L., with the assistance of F.L. and A.L.G, developed the BMDM training
- 806 protocol. M.L.E.L was supervised by E.M.S. and E.C.L. and the work was supervised by E.C.L.
- 807

### 808 **Declaration of Interests**

- 809 The authors declare no competing interests.
- 810

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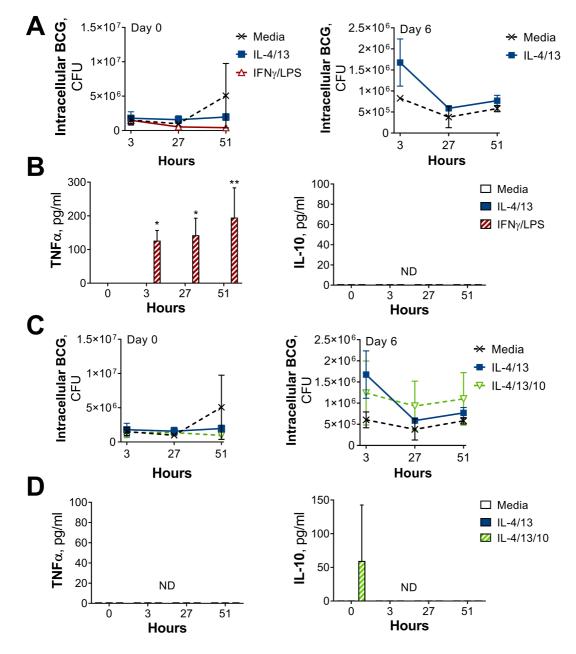
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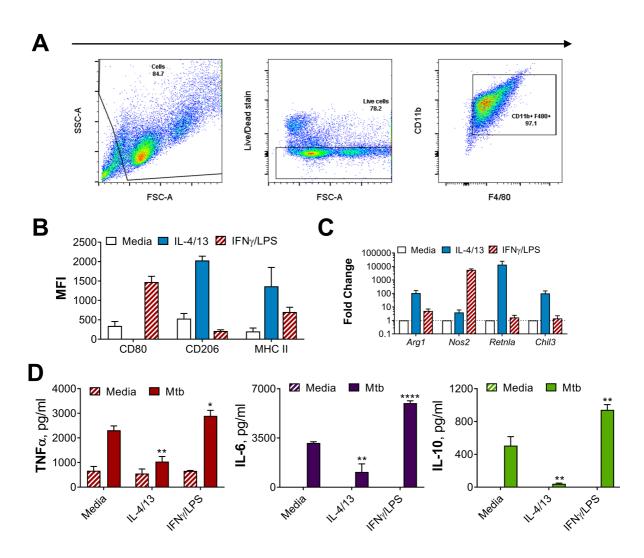
## 1042 Supplemental Information







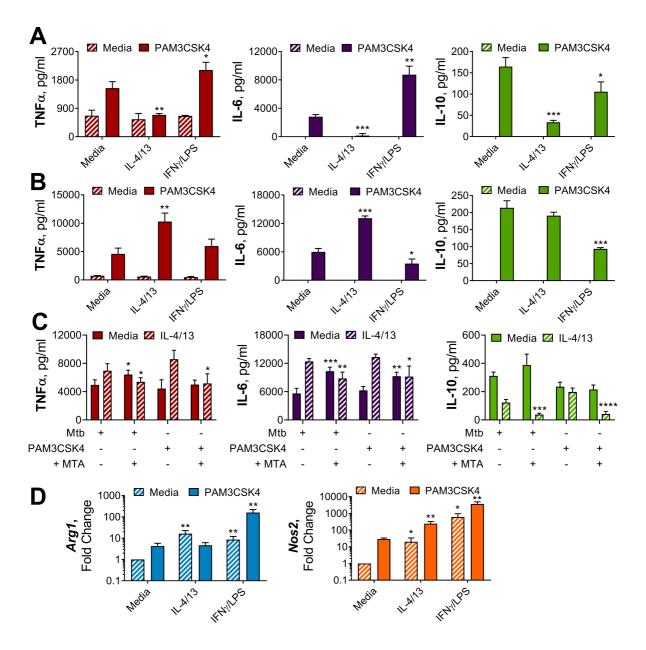
1045 (A-B) BCG Denmark CFU counts (A) and cytokine secretion (B) on Day 0 or Day 6 after h following BMDM BCG 1046 infection. BMDMs were previously incubated with media control, IL-4 with IL-13 or IFNy with LPS for 24 h on Day -1. Representative results (n = 2), standardized to  $0.5 \times 10^6$  cells, shown as mean ± SEM (A-B) and analyzed by 1047 multiple t-test, with Holm-Sidak correction, compared with media control (B). (C-D) BCG Denmark CFU counts 1048 1049 (C) and cytokine secretion (D) on Day 0 or Day 6 after h following BMDM BCG infection. BMDMs were previously 1050 incubated with media control or IL-4 and IL-13, with or without IL-10, for 24 h on Day -1. Representative results 1051 (n = 2), standardized to  $0.5 \times 10^6$  cells, shown as mean ± SEM (C-D) and analyzed by multiple t-test, with Holm-1052 Sidak correction, compared with media control (D). \*  $p \le 0.05$ , \*\*  $p \le 0.01$ . 1053



1054

#### 1055 Figure S2. BMDMs either classically activated with IFNγ and LPS or alternatively activated with IL-4 1056 and IL-13.

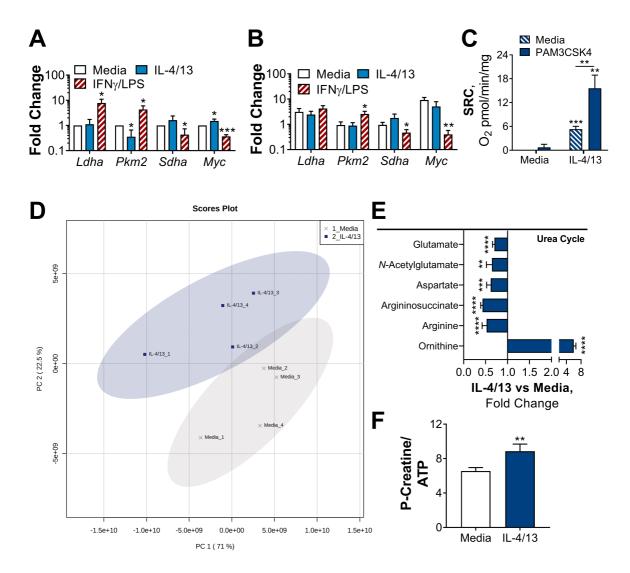
1057 (A) Gating strategy for flow cytometry analysis, gating on cells, live cells and CD11b+ F480+ BMDMs. (B) Surface 1058 marker expression of CD80, CD206 and MHC II on BMDMs incubated with media as a control, IL-4 with IL-13 or 1059 IFNy with LPS for 24 h (n = 3). (C) qPCR of indicated mRNA in BMDMs treated as in (B), standardized to media 1060 control (n = 4). (D) Cytokine secretion from BMDMs incubated with media, IL-4 with IL-13 or IFNy with LPS for 1061 24 h on Day -1 and stimulated with media or irradiated *M. tuberculosis* H37Rv (Mtb) for 24 h on Day 6 (n = 3). 1062 Mean  $\pm$  SD are shown and analyzed by student's t-test, compared to media control. \* p  $\leq$  0.05, \*\* p  $\leq$  0.01, \*\*\* 1063 p  $\leq$  0.001, \*\*\*\* p  $\leq$  0.0001.



#### 1065

Figure S3. Methylation contributes to IL-4 and IL-13 innate training, which enhances inflammatory
 and bactericidal responses following TLR 1/2 and mycobacterial stimulation

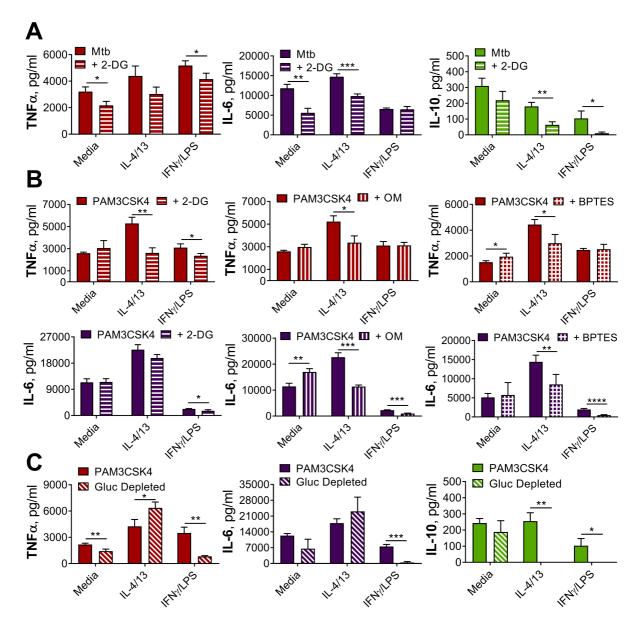
1068 (A-B) Cytokine secretion from BMDMs following incubation with media control, IL-4 with IL-13 or IFNy with LPS 1069 for 24 h on Day -1 and incubated with media or PAM3CSK4 on Day 0 (A) or Day 6 (B) for 24 hours (n = 3). (C) 1070 Cytokine secretion following BMDM incubation with media control or IL-4 with IL-13 for 24 h on Day -1, with or 1071 without 1 hour pre-incubation with methylation inhibitor MTA, and incubation with irradiated *M. tuberculosis* 1072 H37Rv (Mtb) or PAM3CSK4 for 24 h on Day 6 (n = 4). (D) qPCR of indicated mRNA in BMDMs treated as in (B), 1073 standardized to BMDMs incubated with media Day -1 and Day 6 (n = 4). Mean  $\pm$  SD are shown and analyzed by 1074 student's t-test, compared with media control (A-B, D) or comparing with or without MTA (C). \*  $p \le 0.05$ , \*\* p 1075 ≤ 0.01, \*\*\* p ≤ 0.001, \*\*\*\* p ≤ 0.0001.



1077

1078 Figure S4. Challenged BMDMs previously trained with IL-4 and IL-13 retain M2-typical metabolism.

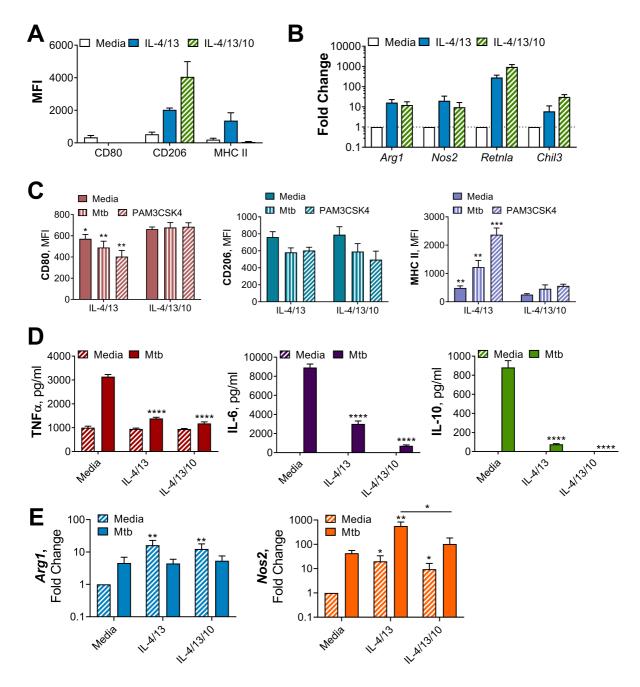
1079 (A-B) qPCR of indicated mRNA in BMDMs following incubation with media control, IL-4 with IL-13 or IFNy with 1080 LPS on for 24 h Day -1 and stimulated with media (A) or PAM3CSK4 (B) on Day 6 for 6 h (Pkm2) and 24 h (Ldha, 1081 Sdha and Myc). Fold change was standardized to BMDMs incubated with media Day -1 and Day 6 (n = 3). (C) 1082 Spare respiratory capacity (SRC) of BMDMs treated as in (A-B), with incubation of media or IL-4 with IL-13 on 1083 Day -1 (n = 3). (D-F) Metabolites isolated from BMDMs following incubation with either media control 1084 (untrained) or IL-4 with IL-13 (trained) for 24 h on Day -1 and stimulation with Mtb for 24 h on Day 6 (n = 4). 1085 Metaboanalyst principal component analysis (PCA) (D), fold change of metabolites from trained BMDMs 1086 compared with media control (=1) (E) and calculated ratio of phosphocreatine (P-creatine) to ATP (F) are shown. 1087 Mean ± SD are shown and analyzed by student t-test, compared with media control. \*  $p \le 0.05$ , \*\*  $p \le 0.01$ , \*\*\* p ≤ 0.001, \*\*\*\* p ≤ 0.0001. 1088



1090

1091 Figure S5. Innate training with IL-4 and IL-13 enhancement of pro-inflammatory responses is not 1092 dependent upon glucose metabolism.

1093(A-B) Cytokine secretion from BMDMs following incubation with media control, IL-4 with IL-13 or IFNy with LPS1094for 24 h on Day -1 and incubation with irradiated *M. tuberculosis* H37Rv (Mtb) (A) or PAM3CSK4 (B) for 24 h on1095Day 6, with or without pre-incubation of metabolic inhibitors oligomycin (OM), 2-deoxy glucose (2-DG) or BPTES.1096(C) Cytokine secretion from BMDMs following incubation with media control, IL-4 with IL-13 or IFNy with LPS for109724 h on Day -1 and incubation with media or PAM3CSK4 for 24 h on Day 6, with or without glucose depleted1098conditions between Day -1 to 7. Mean ± SD (n = 3-4) are shown and analyzed by student's t-test as indicated. \*1099 $p \le 0.05$ , \*\*  $p \le 0.001$ , \*\*\*\*  $p \le 0.0001$ .



1101



1103 (A) Surface marker expression of CD80, CD206 and MHC II on BMDMs incubated with media as a control or IL-4 1104 and IL-13, with or without IL-10,D for 24 h (n = 3) (gating strategy shown Figure S2A). (B) qPCR of indicated mRNA 1105 in BMDMs treated as in (A), standardized to media control (n = 4). (C) Surface marker expression of CD80, CD206 1106 and MHC II on BMDMs following incubation with IL-4 and IL-13, with or without IL-10, for 24 h on Day -1 and 1107 incubated with media, irradiated M. tuberculosis H37Rv (Mtb) or PAM3CSK4 for 24 h on Day 0 (n =3). (D) 1108 Cytokine secretion from BMDMs treated as in (C), incubated with media or Mtb for 24 h on Day 0 (n = 4). Mean 1109  $\pm$  SD (n = 4) are shown and analyzed by student t-test, compared with media control. (E) qPCR of indicated 1110 mRNA in BMDMs treated as in (C), incubated with media or Mtb for 24 h on Day 0, standardized to BMDM 1111 incubated with media on Day -1 and Day 0 (n = 4). Mean ± SD (n = 4) are shown (A-E) and analyzed by student's t-test, compared with media control (D-E), comparing with or without IL-10 (C, E). \*  $p \le 0.05$ , \*\*  $p \le 0.01$ , \*\*\* p1112 1113 ≤ 0.001, \*\*\*\* p ≤ 0.0001.

1114

1116 Table S 1. Primer sequences for reverse transcription PCR.

	Source			
Actb	FP: GCTTCTTTGCAGCTCCTTCGT	Invitrogen Custom		
(RefSeq: NM_007393.5)	RP: CGTCATCCATGGCGAACTG	DNA Oligos		
Arg1	FP: TACAAGACAGGGCTCCTTTCAG	Invitrogen Custom		
(RefSeq: NM_007482.3)	RP: TGAGTTCCGAAGCAAGCCAA	DNA Oligos		
Chitl3	FP: AAGCTCTCCAGAAGCAATCC	Invitrogen Custom		
(RefSeq: NM_009892.3)	RP: AGAAGAATTGCCAGACCTGTGA	DNA Oligos		
Ldha	FP: GAGACTTGGCTGAGAGCATAA	Eurofins genomics		
(RefSeq: NM_010699.2, NM_001136069.2)	RP: GATACATGGGACACTGAGGAA	(MWG)		
Мус	FP: CAGCGACTCTGAAGAAGAGCA	Invitrogen Custom		
(RefSeq: NM_010849.4)	RP: GACCTCTTGGCAGGGGTTTG	DNA Oligos		
Nos2	FP: TCCTGGACATTACGACCCCT	Invitrogen Custom		
(RefSeq: NM_010927.4, NM_001313921.1, NM_001313922.1)	RP: CTCTGAGGGCTGACACAAGG	DNA Oligos		
Pkm2	FP: TGTCTGGAGAAACAGCCAAG	Eurofins genomics		
(RefSeq: NM_011099.4, NM_001378868.1, NM_001378869.1, NM_001378870.1)	RP: CGAATAGCTGCAAGTGGTAGA	(MWG)		
Retnla	FP: CAGCTGATGGTCCCAGTGAAT	Invitrogen Custom		
(RefSeq: NM_020509.3)	RP: AGTGGAGGGATAGTTAGCTGG	DNA Oligos		
Sdha	FP: GGAACACTCCAAAAACAGACC	Eurofins genomics		
(RefSeq: NM_023281.1)	RP: CCACCACTGGGTATTGAGTAGAA	(MWG)		
Тbp	FP: CAGGAGCCAAGAGTGAAGAACA	Invitrogen Custom		
(RefSeq: NM_013684.3)	RP: AAGAACTTAGCTGGGAAGCCC	DNA Oligos		