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# **Dynamic CD4+ T cell heterogeneity defines subset-specific suppression and PD-L1-blockade-driven functional restoration in chronic infection**

**Laura M. Snell**1,2,✉, **Wenxi Xu**1, **Diala Abd-Rabbo**1, **Giselle Boukhaled**1, **Mengdi Guo**1,3, **Bethany L. Macleod**1, **Heidi J. Elsaesser**1, **Kebria Hezaveh**1, **Nirmin Alsahafi**1, **Sabelo Lukhele**1, **Sara Nejat**4, **Ramanandan Prabhakaran**1, **Slava Epelman**3,4,5, **Tracy L. McGaha**1,3, **David G. Brooks**<sup>1,3,⊠</sup>

<sup>1</sup>Princess Margaret Cancer Centre, University Health Network, Toronto, ON, Canada.

<sup>2</sup>Department of Microbiology and Immunology, Indiana University School of Medicine, Indianapolis, IN, USA.

<sup>3</sup>Department of Immunology, University of Toronto, Toronto, ON, Canada.

<sup>4</sup>Toronto General Hospital Research Institute, University Health Network (UHN), Toronto, ON, Canada.

<sup>5</sup>Peter Munk Cardiac Centre, Ted Rogers Centre for Heart Research, Toronto, ON, Canada.

# **Abstract**

Inhibiting PD-1:PD-L1 signaling has transformed therapeutic immune restoration. CD4+ T cells sustain immunity in chronic infections and cancer, yet little is known about how PD-1 signaling modulates CD4<sup>+</sup> helper T (T<sub>H</sub>) cell responses or the ability to restore CD4<sup>+</sup> T<sub>H</sub>-mediated immunity by checkpoint blockade. We demonstrate that PD-1:PD-L1 specifically suppressed CD4<sup>+</sup> T<sub>H</sub>1 cell amplification, prevents CD4<sup>+</sup> T<sub>H</sub>1 cytokine production and abolishes CD4<sup>+</sup>

Competing interests

The authors declare no competing interests.

Additional information

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<sup>✉</sup> **Correspondence and requests for materials** should be addressed to Laura M. Snell or David G. Brooks. lausnell@iu.edu; dbrooks@uhnresearch.ca.

Author contributions

L.M.S. and D.G.B. designed the research. L.M.S., W.X., M.G., B.L.M., H.J.E., S.L., K.H. and N.A. performed the experiments. L.M.S., D.A.-R., G.B., S.N., and R.P. analyzed the data. S.E. and T.L.M. contributed technical expertise and discussion. L.M.S. and D.G.B. wrote the paper.

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cytotoxic killing capacity during chronic infection in mice. Inhibiting PD-L1 rapidly restored these functions, while simultaneously amplifying and activating  $T_H1$ -like T regulatory cells, demonstrating a system-wide  $CD4-T_H1$  recalibration. This effect coincided with decreased T cell antigen receptor signaling, and re-directed type I interferon (IFN) signaling networks towards dominant IFN-γ-mediated responses. Mechanistically, PD-L1 blockade specifically targeted defined populations with pre-established, but actively suppressed proliferative potential, with limited impact on minimally cycling TCF-1<sup>+</sup> follicular helper T cells, despite high PD-1 expression. Thus, CD4+ T cells require unique differentiation and functional states to be targets of PD-L1-directed suppression and therapeutic restoration.

> Robust effector T cell responses are critical to the resolution of viral infection and when compromised, chronic infection ensues. At the onset of what will become a chronic viral infection, sustained antigen signaling remodels the immune environment, driving the production of immunosuppressive cytokines and the expression of multiple inhibitory receptors/ligands that further potentiate viral persistence (for example, IL-10, PD-1, PD-L1, Tim3). This immunosuppressive program diminishes CD8 T cell function (termed T cell exhaustion) and maintains virus-specific T cells in an attenuated functional and distinct epigenetic state that is unable to eliminate infection<sup>1</sup>. Characteristics of cellular and molecular exhaustion are also observed in T cells during cancer, indicating a conserved program of T cell dysfunction in response to chronic antigen stimulation. Further exacerbating cell-intrinsic CD8 T cell dysfunction in chronic infection is the progressive loss of virus-specific CD4<sup>+</sup> type 1 helper T cells  $(T_H1)$  and the reciprocal accumulation of B cell helping  $CD4^+$  follicular helper T cells  $(T<sub>FH</sub>)$  as virus persists<sup>2–5</sup>. Although the exhausted state of CD8 T cells is relatively well-defined, the cellular and molecular changes that comprise CD4**+** T cell functional alterations in chronic infection and cancer are little understood. Further adding to this complexity is the multiple  $T_H$  differentiation states that CD4**+** T cells progress toward, leading to the unique requirement to consider functional changes in molecular programs within the context of specific  $T_H$  differentiation states. CD4<sup>+</sup> T<sub>H</sub>1 cell help is critical to sustain CD8 T cells during viral persistence, and the progressive CD4<sup>+</sup> T<sub>H</sub>1 loss promotes CD8 T cell exhaustion and defective viral control<sup>6</sup>. Therapeutically, transfer of virus-specific CD4<sup>+</sup> T<sub>H</sub>1 cells in the middle of an established chronic infection increased antiviral CD8 T cell numbers and function to enable viral control<sup>6</sup>. Thus, the loss of CD4<sup>+</sup>  $T_H1$  cells is a critical mechanism promoting CD8 T cell dysfunction, and enhancing this distinct virus-specific CD4**+** helper T cell subset can overcome CD8 T cell exhaustion to increase immune control of chronic infections.

Immunotherapy that blocks inhibitory receptors/ligands to reverse T cell exhaustion and enhance immune function has spurred a revolution in treating chronic disease. Among the most successful of these immunotherapies has been the blockade of the PD-1:PD-L1 (PD-1/L1) pathway. PD-1/L1 blockade enhances CD8 T cell function in many viral infections, including chronic lymphocytic choriomeningitis virus (LCMV), HIV, HCV; in numerous preclinical cancer models, and has been particularly successful in a subset of cancer patients<sup>1</sup>. Because CD8 T cells are critical effectors of viral and tumor clearance, the bulk of the work studying the effects of anti-PD-1/L1 therapy has focused on their role. Indeed, a distinct TCF-1**+** memory-like CD8 T cell subset has been identified as

the specific CD8 T cell population targeted by the PD-1/L1-blocking therapy<sup>7–13</sup>. Yet, in certain instances, patients respond to anti-PD-1/ L1 blockade independent of CD8 T cell responses<sup>14,15</sup>, indicating that many cell types are likely responding to and affecting the outcome of this therapy than previously recognized.

PD-1 can be highly expressed on activated CD4**+** T cells, suggesting that these T cells may also be responsive to PD-1/L1-blocking therapies. Although blocking PD-1/L1 is not widely considered to target  $CD4+T$  cells<sup>16</sup>, increasing evidence in patients suggests that, at least in some instances,  $CD4+T$  cells can respond to this therapy<sup>14,17</sup>. The reason underlying these discrepancies in how or why CD4**+** T cells may (or may not) respond to PD-1/L1-blocking immunotherapy is unclear, but may be explained by differences in precursor CD4**+** helper T cell populations. For instance, if anti-PD-1/L1 specifically targets distinct types of CD4**<sup>+</sup>** helper T cell subsets, the therapy will likely be effective only in cases in which these specific helper T cell subsets are present pretreatment. Yet to date, a precise role of PD-1/L1 blockade in restoring CD4**+** T cell responses and the potential for differential helper T cell subset targeting remains unclear.

# **Results**

#### **Virus-specific CD4+ T cell heterogeneity during chronic infection.**

To investigate how exhausted CD4**+** T cells are affected by anti-PD-L1 therapy during chronic viral infection, LCMV-glycoprotein (GP)<sub>61–80</sub>-specific CD4<sup>+</sup> T cell antigen receptor (TCR) transgenic (SMARTA) T cells were adoptively transferred into naïve mice that were subsequently infected 1 day later with LCMV clone 13 (Cl13) to generate a chronic infection. The SMARTA T cells, all expressing the same TCR, functionally and phenotypically recapitulate host-derived endogenous  $GP_{61-80}$ -specific  $CD4^+$  T cells<sup>2,18,19</sup>, and are used to control for inherent differences in strength of TCR signaling in the total population. Twenty-five days after infection, mice were treated with either anti-PD-L1 blocking antibody or isotype control antibody and were continued on this treatment regimen every 3 days. SMARTA cells were analyzed after the first and third treatments and coclustered based on time-of-flight mass cytometric (CyTOF) staining (Extended Data Fig. 1a and Supplementary Tables 1 and 2). PD-L1 blockade did not alter viral titers following one treatment, but in this experiment decreased viral titers were observed after three treatments (Extended Data Fig. 2a). All the CD4<sup>+</sup> SMARTA T cells are primed early after infection<sup>20</sup>, are activated throughout infection and exhibited high PD-1 expression at the start of the treatment. Analysis revealed that the SMARTA T cells formed ten distinct clusters that could be broadly grouped into those that expressed the transcription factor TCF-1 (c1–5, c7 and c10) and those that did not (c6, c8 and c9) (Fig. 1a,b). TCF-1 drives expression of the  $T_{FH}$ transcriptional regulator Bcl-6 (refs.  $21,22$ ), and is absent in T<sub>H</sub>1 cells. Consistent with this, TCF-1-negative c6, c8 and c9 had very low expression of Bcl-6 and expressed multiple  $T<sub>H</sub>1$  cell-associated proteins. In c8 and 9, these included GzmB, Eomes, as well as Tim3 and CD39 (inhibitory receptors that are highly expressed on  $T_H1$  cells), whereas c6 had high expression of T-bet (a transcription factor driving  $T_H1$  differentiation) and SLAMF1 (an activation marker defining  $T_H1$  cells in LCMV infection). Of the  $T_H1$  clusters, c8 was unique in that it expressed the  $T_H1$  chemokine receptor CX3CR1 and appeared to be more

terminally differentiated with a higher proportion of cells expressing Tim3 and GzmB, and the highest expression of CD80 and Lag3 (Fig. 1a). Thus, c6, c8 and c9 were residual  $T_H1$ clusters sustained during chronic viral infection, with c6 a potentially less-differentiated  $T_H1$ population and c8 the most terminally differentiated.

Of the TCF-1**+** clusters, c2 exhibited the highest expression of Bcl-6, CXCR5, ICOS, Helios and was uniquely positive for CD69, suggesting the most differentiated  $T<sub>FH</sub>$  cells (Fig. 1a, b). Although all the CD4**+** SMARTA cells were activated and expressed high levels of PD-1, the T<sub>FH</sub> c2 along with the T<sub>H</sub>1 clusters expressed the highest levels of PD-1, suggesting that these clusters were the most highly activated. The other TCF-1**<sup>+</sup>** clusters c1, c3, c4, c5, c7 and c10 expressed IL-7Rα (CD127), and potentially signify less antigen-engaged, less terminally differentiated cells. Even among the less-differentiated/ less-activated CD127**+**TCF-1**+** clusters, substantial heterogeneity existed suggestive of hybrid  $T_H1/T_{FH}$  cells. For instance, c1, c4, c5 and c7 had high TCF-1 expression, but simultaneously expressed T-bet and some SLAMF1. Cluster 10, on the other hand, appeared to favor neither the  $T_H1$  or  $T_{FH}$  lineages and had the highest expression of CD127, likely being the least differentiated of all the clusters. Thus, extensive heterogeneity exists amongst CD4<sup>+</sup> T cells during chronic viral infection, and in addition to  $T_H1$  and  $T_{FH}$ , multiple hybrid clusters emerge that have characteristics of both  $T_H1$  and  $T_{FH}$  cells.

#### **PD-L1 blockade restores virus-specific CD4<sup>+</sup> T<sub>H</sub>1 cells.**

PD-L1 blockade increased the proportions of the  $T_H1$  clusters (6, 8, 9), and drove a smaller increase in the proportion of c3, while decreasing the proportion of the TCF-1**+** intermediate c4 (Fig. 1a and Extended Data Fig. 2b). The overall number of SMARTA T cells was elevated ( $p = 0.06$ ) following the initial treatment (Extended Data Fig. 2c), primarily as a result of the increased  $T_H1$  clusters, and to a lesser extent from an increase in c3 and c1 (a transitional cluster associating next to the  $T_H1$  cells in UMAP space) (Fig. 1c). Gating on endogenous Foxp3−, PD-1<sup>+</sup>CD4<sup>+</sup> T cells revealed that the T<sub>H</sub>1, but not TCF-1<sup>+</sup> cells were also increased following anti-PD-L1 treatment, confirming that this was not an epitope, TCR or transgenic specific effect (Extended Data Fig. 2d). Unlike  $T_H1$  cells, the proportion and absolute number of the most differentiated  $T_{FH}$  c2 was largely unaffected by PD-L1 blockade at this early timepoint, despite the high levels of PD-1 expression (Fig. 1a–c and Extended Data Fig. 2b). Direct comparison within the same mouse further revealed that the fold changes were significantly higher in the  $T_H1$  cells following PD-L1 blockade compared with the small increases observed in the  $T<sub>FH</sub>$  cluster (Fig. 1d). Functionally, anti-PD-L1 blockade increased IFN-γ-producing virus-specific CD4**+** T cells, as well as the amount of IFN-γ produced per cell, while simultaneously increasing virus-specific CD4**+** T cells producing IL-10 (Fig. 1e and Extended Data Fig. 2e), suggesting a negative feedback inhibition induced by the enhanced stimulation, but also consistent with observations that IL-10 production is specifically produced by  $T_H1$  cells during chronic viral infection<sup>23</sup>. On the other hand, there was no difference in the proportion or numbers of TNF-producing virus-specific CD4**+** T cells (Fig. 1e and Extended Data Fig. 2e), indicating that not all cytokines were enhanced by blocking PD-L1. PD-1-deficient virus-specific CD4**+** T cells also exhibited significantly increased  $T_H1$  differentiation by both proportion and number, as well as enhanced IFN- $\gamma$  production, with only minimal effects on T<sub>FH</sub> numbers (Fig.

1f), thus demonstrating the CD4<sup>+</sup> T cell-intrinsic nature of PD-1 signaling is to inhibit  $T_H1$ expansion and function throughout chronic viral infection.

After three anti-PD-L1 treatments (8 days after the initiation of treatment and 33 days after infection), there was a numerical increase in the majority of CD4**+** SMARTA T cell clusters in the PD-L1 blocked mice, corresponding to the maintenance of these cells between these treatments (Extended Data Fig. 2f). Further, the number of IFN- $\gamma$  and IL-10 expressing cells remained elevated following three anti-PD-L1 treatments (Fig. 1g). PD-L1 blockade also increased numbers of CD4<sup>+</sup> T<sub>H</sub>1 SMARTA cells in the liver and lungs following three treatments, and although Bcl-6hi  $T<sub>FH</sub>$  populations were not present in these nonlymphoid organs, the population of Bcl-6lo TCF-1**+** cells was less responsive to PD-L1 blockade (Extended Data Fig. 2g). Thus, anti-PD-L1 specifically increases the proportion and number of virus-specific CD4<sup>+</sup> T<sub>H</sub>1 cells in both lymphoid and nonlymphoid organs.

#### **Blocking PD-L1 targets precycling CD4+ TH1 populations.**

To determine the origin of the increased  $T_H1$  cells following PD-L1 blockade, we examined the trajectory of virus-specific CD4**+** T cells following anti-PD-L1 treatment. Overlaying the UMAP clusters onto a diffusion pseudotime map<sup>24</sup> revealed three tips  $(T)$ , which form the most distant endpoints of each branch and indicate the beginning or end of a differentiation state (Fig. 2a and Extended Data Fig. 3a). T1 was a  $T<sub>FH</sub>$  cell in c2; T2 was a cell from the most differentiated T<sub>H1</sub> c8; and T3 was a cell in the immature/transitional SLAMF1<sup>+</sup>  $T<sub>H1</sub>$  c6. Pseudotime diffusion analysis identified two branches that mapped from the central SLAMF1<sup>+</sup> T<sub>H</sub>1 cell T3 root, where it could either progress towards the T<sub>FH</sub> fate (as nor mally occurs during chronic viral infection as  $T_H1$  cells convert to  $T_{FH}^2$ , or towards more differentiated  $T_H1$  clusters. To identify which of these directions was favored by PD-L1 blockade, we overlaid changes in cell number following anti-PD-L1 treatment onto the diffusion pseudotime map. Blocking PD-L1 rapidly increased both the proportion and numbers of the clusters on the branch towards the highly differentiated  $T_H1$  c8 in T2 (Fig. 2a), suggesting that anti-PD-L1 diverts  $CD4+T$  cells from the normal  $T<sub>FH</sub>$  differentiation branch in chronic infection and can push less-committed  $T_H1$  cells towards the differentiated  $T_H1$  lineage.

PD-L1 blockade rapidly increased the proportion and the number of Ki67**+** (that is, cycling) virus-specific CD4**+** T cells (Fig. 2b and Extended Data Fig. 3b). The vast majority of Ki67<sup>+</sup> cells in the isotype-treated group (representing pretherapy) were in the  $T_H1$  c6 and c8, and the  $T_H$ 1-associating c1 (Fig. 2c). Critical for these analyses, the SMARTA cells were not clustered using Ki67 to prevent algorithmic clustering of cycling cells (Supplementary Table 2). Although the frequency of Ki67<sup>+</sup> cells increased following PD-L1 blockade (Fig. 2b), the distribution of clusters that expressed Ki67 was generally unchanged (Fig. 2c). The exception to this was the T<sub>H</sub>1 c9, which exhibited low Ki67 expression in isotypetreated mice, but was robustly induced by anti-PD-L1 treatment (Fig. 2c). The increase in c9 is consistent with the pseudotime trajectory analysis indicating that activated cells in c6 progress through c9 toward the most differentiated population of  $T_H1$  cells in c8. Conversely, c8 started out with the highest frequency of Ki67**+** cycling cells and this was then maintained following anti-PD-L1 therapy. Whereas the frequency of Ki67<sup>+</sup> cells in  $T_{FH}$ 

c2 and intermediates c4 and c5 were also enhanced upon PD-L1 blockade (Fig. 2c), the proportion of these cells remained small, and did not lead to an increase in the absolute numbers of those clusters, as was observed for the  $T_H1$  clusters (Fig. 1c).

The majority of Ki67**+** cells in both isotype and anti-PD-L1 treated mice similarly expressed  $T<sub>H</sub>1$  proteins CD39, T-bet and SLAMF1, and largely failed to express CD69 (Fig. 2d), a protein specifically on the c2 T<sub>FH</sub>. Further, the Ki67<sup>+</sup> SMARTA cells in both isotype and anti-PD-L1 treated mice exhibited highly overlapping protein expression patterns with each other, and were more similar to each other than to their respective Ki67-negative cells (Fig. 2e and Extended Data Fig. 3c), further suggesting anti-PD-L1 blockade preferentially expands pretreatment cycling clusters. Even early in infection (day 10 after LCMV-Cl13 infection), Ki67 was predominantly confined on to the  $T_H1$  c4, c6, whereas the majority of TCF-1<sup>+</sup> clusters, and particularly the most differentiated  $T<sub>FH</sub>$  subset c1, expressed less Ki67 (Extended Data Fig. 3d). Thus, PD-1 limits the expansion of the most proliferative CD4<sup>+</sup> T<sub>H</sub>1 cell subset throughout chronic infection, and blocking PD-L1 overcomes these constraints.

#### **PD-L1 blockade targets TH1-phenotype T regulatory cells.**

Foxp3<sup>+</sup> T<sub>reg</sub> cells comprise approximately 20% of total CD4<sup>+</sup> T cells during chronic viral infection and can differentiate into different Th-like subsets to suppress antiviral responses<sup>25</sup>. Importantly, SMARTA cells in LCMV infection do not become  $T_{reg}$  cells<sup>20</sup>, although in other infections virus-specific CD4**+** T cells potentially could. The frequency of  $T_{reg}$  cells rapidly increased after the first anti-PD-L1 treatment compared with isotypetreated mice and PhenoGraph clustering revealed eight distinct clusters that again broadly categorized into TCF-1**+** (c1, c3, c4, c7, c8) and TCF-1-negative (c2, c5, c6) populations, with the TCF-1-negative  $T_{reg}$  cells expressing T-bet to both higher levels and in a larger proportion of cells (Fig. 3a,b and Supplementary Table 3). PD-L1 blockade did not numerically affect the TCF-1<sup>+</sup> clusters, but increased the TCF-1-negative,  $T_H$ 1-like c2, c5, c6 (Fig. 3b,c and Extended Data Fig. 4a,b). Although all  $T_{reg}$  cells were gated based on Foxp3 positivity (Extended Data Fig. 1b), Foxp3 expression itself, along with  $T_H1$ associated inhibitory receptors CD39 and Tim3, as well as activation markers CD27, CD44 and SLAMF1 were all enriched in the  $T_H1$ -phenotype clusters (Fig. 3b). These  $T_H1$  clusters also had the highest expression and contained the majority of ICOS**+**, CTLA4**+** and PD-1**<sup>+</sup>** cells, demonstrating heightened activation of the  $T_H1$ -phenotype  $T_{reg}$  cells during chronic infection.

PD-L1 blockade also rapidly increased the expression of multiple activation/inhibitory proteins (including CTLA4, ICOS, CD80, CD86, SLAMF1) on the  $T_H1$ -phenotype clusters compared with isotype treatment (Fig. 3d). Although anti-PD-L1 therapy did not bolster the number of TCF-1<sup>+</sup> T<sub>reg</sub> cells, it did increase their expression of proteins such as PD-1, Helios, SLAMF1, ICOS and CTLA4 on multiple clusters (Fig. 3d), indicating that these populations were also being affected by the therapy. The inhibitory receptor CTLA4 was upregulated on multiple  $T_{reg}$  cell clusters following anti-PD-L1 (c2–5, c8), but it had much lower/nondetectable expression on the virus-specific CD4<sup>+</sup> T cells. T<sub>reg</sub> cell depletion led to increased numbers of CD4<sup>+</sup> T<sub>H</sub>1 cells, but not T<sub>FH</sub> cells, with a particular restoration

of GzmB<sup>+</sup>CD4<sup>+</sup> T<sub>H</sub>1 cells (Extended Data Fig. 4c), indicating that consistent with their activated T<sub>H</sub>1-phentoype, T<sub>reg</sub> cells in the chronic infection preferentially suppress T<sub>H</sub>1 responses.

At baseline and following PD-L1 blockade, a higher proportion of  $T_{reg}$  cells expressed Ki67 than did the virus-specific CD4**+** T cells (Fig. 3e). PhenoGraph clustering was performed in the absence of Ki67 (Supplementary Table 3), and again, the Ki67**+** cycling cell clusters at the onset of therapy were predominantly confined to the  $T_H$ 1-like  $T_{reg}$  cells (c2, c5) (Fig. 3f). The cycling clusters that were present pretherapy (that is, in isotype-treated mice) were generally also the ones that were expanded by anti-PD-L1, and although an increase in the frequency of Ki67<sup>+</sup> cells also occurred in  $T_{\text{reg}}$  clusters c3, c6 and c8 (Fig. 3f), only the  $T_H$ 1-like c2, c5 and c6 were increased numerically (Fig. 3c and Extended Data Fig. 4a). Comparison of the Ki67**+** cells in isotype and anti-PD-L1 conditions showed that cycling T<sub>reg</sub> cells exhibited similar protein expression patterns, with the vast majority of Ki67<sup>+</sup> T<sub>reg</sub> cells expressing T-bet, ICOS and CTLA4, and high CD39, whereas the majority of the cycling cells in both conditions failed to express TCF-1 and CD69 (Fig. 3g). The similar overall protein expression patterns by cycling cells in isotype- and anti-PD-L1 treated mice suggested that specific pre-established populations of cycling virus-specific CD4<sup>+</sup> T<sub>H</sub>1 cells and  $T_H$ 1-like  $T_{reg}$  cells are specifically expanded by PD-L1 blockade.

Following the third anti-PD-L1 treatment, the number of total and  $T_H1$ -phenotype  $T_{reg}$ cells had contracted to the same level as in isotype-treated mice (Fig. 3h and Extended Data Fig. 4d). Yet, PD-L1 blockade continued to drive higher levels of activation proteins, particularly in T<sub>H</sub>1-like c2, c5 and c6, whereas the TCF-1<sup>+</sup> T<sub>reg</sub> cells appeared to be only minimally changed (Extended Data Fig. 4e). Despite the contraction, the  $T_H1$ -like c2 and c5 still comprised the majority of the Ki67**+** cells in both isotype and anti-PD-L1 groups, although the proportions of Ki67<sup>+</sup> cells within these  $T_H1$  clusters were no longer significantly elevated in response to PD-L1 blockade (Extended Data Fig. 4f). Like the cycling virus-specific CD4**+** T cell populations, the Ki67**+** cells following the first and third anti-PD-L1 treatments had concordant protein expression patterns both between time points, and between isotype and anti-PD-L1 treatment (Fig. 3i and Extended Data Fig. 4g), indicating that like the virus-specific CD4<sup>+</sup> T cells, the T<sub>H</sub>1-like T<sub>reg</sub> cells are targeted by PD-1/PD-L1 to limit their expansion and activation state.

 $T_{reg}$  cells in nonlymphoid organs (the liver and lung) increased following three anti-PD-L1 treatments, at a time when  $T_{\text{reg}}$  cell amplification in the spleen had returned to baseline (Fig. 4a). To determine whether this increase was the result of local proliferation versus an influx of  $T_{reg}$  cells from the lymphoid organs, we treated mice just before and then during anti-PD-L1 treatment with the drug FTY720 (fingolimod) to prevent cell emigration from lymphoid tissue. FTY720 treatment reduced  $T_{reg}$  cells in the isotype conditions (Fig. 4b), suggesting that ongoing  $T_{reg}$  cells in the lung and liver during chronic infection are replenished by homing from lymphoid organs. Yet, even with FTY720 treatment, PD-L1 blockade expanded the number of  $T_{reg}$  cells in the liver and lung (Fig. 4b). Further, PD-L1 blockade increased  $T_{reg}$  cell infiltration into the liver and lung tissue parenchyma, and within the spleen from the red pulp to the white pulp<sup>26</sup> (Fig. 4c). Thus, PD-L1 blockade expands  $T_{reg}$  cells directly in nonlymphoid organs, and functions to amplify  $T_{reg}$  presence within

the tissue parenchyma of these organs, where they are potentially positioned to interact and suppress effector T cells.

#### **Gene expression changes by virus-specific CD4+ T cells following PD-L1 blockade.**

We next performed single-cell RNA-sequencing (scRNA-seq) on SMARTA T cells following isotype or anti-PD-L1 treatment. Analysis was performed after the third antibody treatment to allow for network redistributions to take hold, while viral titers were not yet decreased by PD-L1 blockade in this particular experiment (Extended Data Fig. 5a). Cellcycle genes were regressed out before clustering (akin to clustering CyTOF data without Ki67). Of the eight clusters that emerged, only c2 and c3 increased following anti-PD-L1 blockade and these were characterized by expression of  $T_H1$ -cell genes, including *Ifngr*, Ifng, Gzmb, Ccl5, Selplg (encoding PSGL1) and Nkg7 (Fig. 5a–c). c3 was a highly differentiated  $T_H1$  cluster (corresponding to c9 and some of c8 in the CyTOF analysis Fig. 1), and exclusively expressed *Prdm1* (encoding Blimp1) and had the majority of *Gzmb* expression (Fig. 5c).  $Tcf7$  (encoding TCF-1) was widely expressed by most clusters, but was largely absent from c3 and only present in the proportion of c2 that lacked *Gzmb* expression (Fig. 5c), suggesting c2 is a transitional population containing cells further differentiating to  $T_H1$ , akin to c1 and c6 in the CyTOF clustering. All clusters were activated, although c0 was the least differentiated cluster, expressing *II7ra* (CD127), *Tcf7* and *Ccr7*, characteristic of more quiescent cells (Fig. 5b,c). c5 was comprised of bona fide  $T<sub>FH</sub>$  cells expressing Ascl2,  $Bcl-6$  and Cxcr5, whereas c1 was composed of cells expressing  $T<sub>FH</sub>$ -associated genes, but not their lineage-defining transcription factors, thus we defined these as less-differentiated T<sub>FH</sub>. c7 expressed high amounts of IFN-stimulated genes (ISGs), and seemed to encompass both  $T_H1$  and  $T_{FH}$  cells, indicating clustering was driven by the ISG signature and not a specific differentiation program. c6 had high expression of the genes Xcl1, Slamf7, Tnfrsf9 and Crtam, and appeared to be a hybrid between  $T_H1$  and  $T_{FH}$ , expressing molecules such as Gzmk and Runx3, but also Tcf7, Sostdc1 and Bcl-6.

When all the clusters were combined, there were 461 significantly differentially expressed genes (DEG) following PD-L1 blockade (adjusted  $P < 0.05$ ) (Supplementary Table 4). However, none increased more than twofold, and only Rps18-ps3, (ribosomal protein S18 pseudogene 3), and three predicted genes (Gm6133, Gm98433, Gm2000) reached twofold decreases upon blockade, indicating that at the population level the cells were transcriptionally similar following therapy. Of the DEG in the total SMARTA cell population, there was an overall increase in  $T_H1$  signature genes following PD-L1 blockade, including Nkg7, Ccl5, Selplg and Lgals3, which was accompanied by a global decrease in T<sub>FH</sub> signature genes including Sostdc1, Tnfsf8 (encoding CD30L), Tcf7, Izumo1r (encoding for JUNO),  $\eta$ 21 and CD40lg (Fig. 5d, Extended Data Fig. 5b). The decreased T<sub>FH</sub> signature gene expression also occurred within the  $T<sub>FH</sub>$  and  $T<sub>FH</sub>$ -like clusters, suggesting that despite a lack of expansion, the nature of these cells was also being fundamentally altered (Supplementary Table 4). Along with the diminished  $T<sub>FH</sub>$  gene expression, PD-L1 blockade decreased  $II21$  production (a factor critical for control of chronic viral infection<sup>19,27,28</sup>), which was produced by both  $T_H1$  and  $T_{FH}$  in isotype conditions and now had only minimal residual expression in  $T<sub>FH</sub>$  phenotype cells (Fig. 5d). Although the decreased  $T<sub>FH</sub>$  gene signature was evident across all SMARTA cell clusters following PD-L1 blockade, the

increase in  $T_H1$  driving genes was largest in c2 (the transitional  $T_H1$  cluster) and in some cases the less-differentiated, centrally located c0. c2 itself expressed 64 DEG in anti-PD-L1 versus isotype treatment, with more than twofold increased expression of  $T_H1$ -associated genes, including Plac8, (placenta specific 8) Ctla2a (cytotoxic T lymphocyte-associated protein 2 alpha), Klrd1 (killer cell lectin like receptor D1) and  $Ly6c2$ , as well as  $Nkg7$ and Lgals3 (encoding galectin3) (Fig. 5e and Extended Data Fig. 5b). c0 and c1 expressed 140 and 68 DEG respectively, whereas clusters 3–7 expressed fewer than 40 DEG each (Supplementary Table 4). Many of the DEG in c0 and c1 were ribosomal proteins that were downregulated upon PD-L1 blockade.  $T_H1$  genes were also upregulated in these clusters upon PD-L1 blockade (particularly c0) with genes such as  $Nkg7$ , Ccl5 increased in c0 and c1, and genes such as Sostdc1, Tnfsf8 (encoding CD30L), Tnfrsf4 (encoding OX40) and Il21 decreased in c0 (Supplementary Table 4). In addition, anti-PD-L1 therapy increased Il7ra and Bcl2 expression in c0, suggesting enhanced cell survival of this less-differentiated population that likely were precursors to  $T_H1$  cells. Thus, not only were  $T_H1$  clusters enhanced by proportion and number by PD-L1 blockade, but there was a system-wide recalibration towards the  $T_H1$  differentiation state.

To analyze the transcriptional programs pushing the transition of the  $T_H1$  cells, we compared the genes differentially regulated from the transitional  $T_H1$  c2 with the terminally differentiated  $T_H1$  c3. Compared with c2, c3 exhibited increased expression of multiple  $T_H1$  defining and modulating genes, including increased expression of *Ifng* and multiple inhibitory receptors, including Lag3, Pdcd1 and Entpd1 (encoding CD39) (Fig. 5f and Extended Data Fig. 5c). Further, c3 was the only cluster that produced Il10 (Extended Data Fig. 5c), indicating feedback inhibition by the most terminally differentiated  $T_H1$  cells. PD-L1 blockade itself did not directly enhance these genes in c3 compared with isotype, indicating instead that PD-L1 directed the less-differentiated  $T_H1$  cells down a terminal differentiation pathway leading up to c3. The expression of transcription factor Tox (which drives CD8 T cell exhaustion<sup>29-31</sup>), *Eomes* (which associates with exhausted CD8 T cells<sup>32</sup>) and Maf which can drive  $III0$  expression<sup>33</sup> were increased in c3 compared with c2 (Fig. 5f), indicating that the transcriptional transformations associated with CD8 T cell exhaustion underlay the transition to CD4<sup>+</sup> T<sub>H</sub>1 terminal differentiation during chronic infection.

#### **Network profiling reveals global transcriptional changes.**

We next measured putative upstream regulators of DEGs in total cells, and focused on the T<sub>H</sub>1 c2 and c3, as well as the T<sub>FH</sub> c5, to understand how blocking PD-L1 modified the downstream  $T_H1$  and  $T_{FH}$  cell transcriptional programs. Upstream regulator analysis predicted PD-L1 blockade-induced activation of central  $T_H1$  differentiation networks (for example, Tbx21, Id2, Tet2, IRF4), and inhibition of  $T<sub>FH</sub>$  driving cytokine networks (IL6, IL27, IL21, STAT3) (Fig. 6a). These occurred in conjunction with the predicted downregulation of  $T<sub>FH</sub>$ -associated regulators CD40lg and CD28 in c5, and the predicted activation of multiple upstream regulators for networks that control cellular proliferation (for example, Myc, Mycn, Itk, Ccnd1), particularly in c2. Chronic IFN-I signaling suppresses antiviral  $CD4+T$  cell proliferation and function in chronic viral infection<sup>34,35</sup>, and multiple IFN-I related upstream regulators (IFN-α/β, IFN-α1/ IFN-α13, IFN-α2, IFN-αR1, JAK1/2) were predicted to be inhibited upon PD-L1 blockade in both  $T_H1$  and  $T_{FH}$  clusters, whereas

regulation through the SOCS1 network, an inhibitor of IFN-I signaling, was predicted to be elevated in the transitional  $T_H1$  population c2, as well as the  $T_{FH}$  population c5. In line with diminished IFN-I mediated regulation, PD-L1 blockade decreased expression of numerous ISGs, such as *IRF7* and *OAS1a*, while reciprocally elevating  $T_H1$ -driving ISGs, such as Ccl5 and Ifngr (Fig. 6b and Extended Data Fig. 6a). Unexpected with the increased cycling and activation states of virus-specific  $CD4+T_H1$  cells following PD-L1 blockade, TCR signaling (TCR, CD3, NR4A1 (encoding Nur77)) and multiple key immuneactivating signaling pathways induced by TCR signaling (NFATC, RICTOR, NFKB) were predicted to be inhibited by PD-L1 blockade. Deeper examination revealed downregulation of many TCR-stimulated transcription factors by PD-L1 blockade (Fig. 6c), corresponding to a global diminution of TCR signaling strength when PD-L1 is inhibited. Only a few TCR-driven transcription factors were increased following PD-L1 blockade, particularly in the transitional T<sub>H</sub>1 c2, and these were specifically associated with T<sub>H</sub>1-fate determination and included *Prdm1* and *Klf2*, as well as  $Tsc22d3$  which is stimulated by IL-10 (Fig. 6c). Further, Nur77 protein expression, which is directly associated with the strength of TCR signaling<sup>36</sup>, was decreased rapidly (and before decrease in viral titers) in virus-specific CD4**+** T cells from anti-PD-L1 treated compared with isotype-treated mice (Fig. 6d and Extended Data Fig. 6b). Both heightened and chronic TCR signaling promote conversion of  $T_H1$  to  $T_{FH}$  cells<sup>2,37</sup>, suggesting that blocking PD-L1 reduces TCR signaling networks to re-establish  $T_H1$  programming.

To further probe anti-PD-L1 mediated changes in transcription factor activity and their downstream target gene networks, we used the algorithm SCENIC (single-cell regulatory network interference and clustering)<sup>38</sup>. SCENIC identifies each transcription factor and its direct binding targets in the same cell (termed regulons) based on coexpression profiles and cis-regulatory motif enrichment. Quantification of the fold change in average regulon activity indicated that the decreased expression by scRNA-seq of multiple transcription factors involved in TCR signaling following PD-L1 blockade corresponded to a similar decrease in their target RNAs (regulons), including regulons driven by Fos, Jun, Nfatc1, Maf and Relb (Fig. 6e). The  $T<sub>FH</sub>$  c5 had a generally higher activity score for many of these regulons than the  $T_H1$  clusters during chronic infection, consistent with strong TCR signaling driving the T<sub>FH</sub> phenotype. Yet, even in this T<sub>FH</sub> c5, target regulons driven by Fos, Hif1a and Nfatc1 were significantly decreased upon anti-PD-L1 therapy. Although Eomes RNA was decreased following PD-L1 blockade, its target regulons remained elevated in c2 and c3, suggesting a delay in the transcriptional decrease in its expression and the functional activity of the protein. Conversely, the increased expression of Prdm1 following PD-L1 blockade was mirrored in increased expression of its target regulons, further corroborating the re-enforcement of  $T_H$ 1-like genes programing.

Pathway analysis of the individual cell clusters indicated enrichment of pathways involved in positive regulation of translation, RNA splicing, cell cycling and cellular metabolic processes when PD-L1 was inhibited (Extended Data Fig. 6c), indicating metabolic reprogramming of virus-specific CD4**+** T cells. Corresponding to the overall virus-specific CD4**+** T cell survival observed following PD-L1 blockade, stress response pathways such as "response to cold", and pathways of negative regulation of apoptosis were increased across most of the clusters. Specifically, within the less-differentiated CD4<sup>+</sup> T<sub>H</sub>1 c2, but not

the terminally differentiated  $T_H1$  c3, PD-L1 blockade amplified multiple pathways involved in DNA replication and cell-cycle progression, further indicating cell-intrinsic modulation of cell-cycle machinery fueling expansion of the  $T_H1$  c2 population and c3 arising from these cells. Conversely, following PD-L1 blockade, c3 was enriched for pathways of  $T_H1$ functional activity, regulation of lymphocyte migration, leukocyte-mediated cytotoxicity and decreased STAT3 signaling (STAT3 is known to inhibit  $T_H1$  differentiation<sup>39</sup>) (Fig. 6f). Like the widespread inhibition of upstream regulation by IFN-I, the pathway "*response to* interferon-alpha" was one of the few pathways downregulated in c2 and c3 of the anti-PD-L1 treated group (Fig. 6f). Conversely, both c2 and c3 had increased signatures of IFN-γ activation and signaling, indicating a switch from chronic IFN-I toward IFN-γ signaling in response to PD-L1 blockade. Both c2 and c3 had gene signatures associated with CD8 T cell effector function following anti-PD-L1 therapy (c2 up in "effector vs exhausted CD8 T cells"; c3 up in "leukocyte-mediated cytotoxicity") (Fig. 6f), suggesting the molecular acquisition of a gene signature pushed toward CD8 T cell effector functions.

#### **PD-L1 blockade drives a CTL gene signature and resurrects CD4+ killing capacity.**

The increased signatures of CD8 T cell effector functions and IFN- $\gamma$  signaling suggested that the TH1 may acquire cytolytic function when PD-L1 signals are inhibited. Indeed, multiple cytotoxic mediators including  $Nkg7$ , Runx3 (the transcription factor that drives cytotoxic function in CD8 T cells), Gzmb, Gzmk, Fasl, Ctla2a, Klrd1 and Klrk1 (encoding NKG2D) were preferentially expressed in  $T_H1$  clusters 2 and 3 (Fig. 7a and Extended Data Fig. 7), and were increased in expression and/or by proportion upon PD-L1 blockade. (Fig. 7b). By contrast, the non- $T_H1$  clusters lacked or had minimal expression of these cytotoxic mediators and failed to upregulate them (Fig. 7a and Extended Data Fig. 7), suggesting the cytotoxic signature was localized to the  $T_H1$  cells. To directly test whether PD-L1 blockadeinduced changes in virus-specific CD4**+** T cell cytolytic function, we performed an in vivo CD4**+** cytotoxic T lymphocyte (CTL) assay. To ensure killing was mediated by CD4**+** T cells and was CD8<sup>+</sup> T cell independent, we used  $\beta_2$ -microglobulin ( $\beta_2$ M) deficient splenocytes (that is, lacking MHC class I expression) as target cells. The splenocytes were labeled with LCMV-GP $_{61-80}$  peptide (the SMARTA epitope) or an irrelevant peptide (OVA $_{323-339}$ ) and then coinjected into LCMV-Cl13 infected mice after the third anti-PD-L1 treatment. Naïve mice demonstrated no specific killing of MHC II**+** target cells compared with OVA323–339 labeled cells (Fig. 7c). Mice acutely infected with LCMV-Armstrong exhibited approximately 55% specific killing of transferred LCMV-GP61–80 labeled MHC II**+** target cells, whereas this killing was completely abolished in chronically infected isotype-treated mice. Interestingly, PD-L1 blockade completely restored CD4**+** T cell mediated killing to levels observed in the acutely infected mice. The CD4**+**-mediated killing was MHC class II dependent, as target cells that lacked MHC class II failed to be killed within the same mice (Fig. 7c). Thus, anti-PD-L1 enhances CD4**+** cytotoxic gene networks and restores CD4**+** T cell mediated killing during chronic infection, identifying a new mechanism of action of PD-L1 blockade therapy to restore immune function.

## **Discussion**

To date, the role of PD-L1 blockade to restore exhausted antigen-specific CD4**+** T cells has been unclear. Our data now demonstrate that anti-PD-L1 therapy in chronic viral infection specifically and cell-intrinsically enhances  $T_H1$  subsets. Indeed, as chronic viral infection persists,  $T_H1$  cells are gradually lost, exasperating CD8 T cell dysfunction<sup>2,6</sup>. In addition to conventional virus-specific CD4<sup>+</sup> T cells, we identify that  $T_H1$ -phenotype  $T_{reg}$  cells are highly responsive to PD-L1 blockade, through expansion, upregulation of suppressive factors and migration into nonlymphoid tissue.  $T_H1$ -phenotype  $T_{reg}$  cells specifically limit  $T_H1$  responses<sup>40</sup>, and consistent with this, we observed that  $T_{reg}$  cell depletion during chronic infection preferentially increased  $T_H1$  cells, with minimal effect on  $T_{FH}$  cells. The rapid increase in  $T_{reg}$  cells by blocking PD-L1 likely reflects feedback inhibition to prevent excessive immunopathology, but likely also explains how they impede CD8 T cell restoration following PD-L1 blockade in chronic infection<sup>41</sup>. Thus, while restoring virus-specific CD4<sup>+</sup> T<sub>H</sub>1 cells, PD-L1 blockade simultaneously releases counter-measures to cull back this response. PD-L1 blockade did not indiscriminately target CD4**+** T cells, but instead the pre-established cycling capacity of specific populations was a major determinant of responding cells, with only limited incorporation of noncycling ones into the therapeutic response. In this way, PD-L1 specifically acts to limit cellular proliferation and makes the highly proliferative  $T_H1$  subsets the prime target in chronic virus infection. Thus, in cases when CD4<sup>+</sup> T cells fail to respond to PD-1/L1 blockade therapies, pre-existing cycling antigen-specific subsets may not be present. Yet, it is important to point out that in other disease states where different CD4<sup>+</sup> T<sub>H</sub> subsets are highly proliferative, these too may be targeted.

TCF-1**+** memory-like CD8 T cells rapidly proliferate and have been shown to be the primary target of PD-L1 blockade<sup>7-13</sup>. On the other hand, the TCF-1<sup>+</sup> CD4<sup>+</sup> T cells were only minimally affected by therapy during chronic infection, suggesting that TCF-1**+**CD4**+** and CD8**+** T cells may function at different ends of the spectrum in response to PD-L1 blockade. CD4<sup>+</sup> T<sub>FH</sub> can respond to immunotherapy in some cancers, particularly breast cancer<sup>42</sup>, although these therapies often incorporate anti-CTLA4 which can expand CD4<sup>+</sup> T cells<sup>16</sup>, enhance  $T_{FH}$  cells<sup>43</sup> and indirectly alter CD4<sup>+</sup> T cell responses through modulation of  $T_{reg}$ cells44,45. Anti-PD-1-mediated tuberculosis reactivation in cancer patients exhibits increased Mtb-specific CD4<sup>+</sup> T<sub>H</sub>1, but not T<sub>H</sub>17 cells, suggesting that T<sub>H</sub>1 cells can indeed respond to anti-PD-1 therapy in contexts other than viral infection<sup>46</sup>. Thus, based on these dichotomies, it will be important to further uncover the basis for disease-specific CD4<sup>+</sup> T<sub>H</sub> restoration by PD-L1 blockade and how they contribute to disease control (or exasperation).

Considering that PD-1 functions to attenuate TCR signaling47, it was unexpected that blocking PD-L1 would decrease TCR signaling and downregulate expression of multiple transcription factors and their target genes. However, increased TCR signaling can potentiate CD8 T cell exhaustion<sup>1</sup> and pushes virus-specific CD4<sup>+</sup> T cell differentiation toward  $T_{FH}^2$ . Not all transcription factors were decreased following PD-L1 blockade, with specific increases in transcription factors associated with  $T_H1$  programming and differentiation. Thus, blocking PD-L1 and decreasing TCR signaling likely enables the cells to reroute

toward  $T_H1$  amplification and functions; and paradoxically, the decrease in chronic TCR signaling favors restoration of  $CD4+T_H1$  cells.

Combined with diminishing  $CD4+T_H1$  responses, we identify the loss of CTL capacity as a CD4**+** T cell dysfunction during chronic infection and demonstrate that CD4**+** CTL transcriptional networks and killing capacity are completely restored by blocking PD-L1. In this way, not only can anti-PD-L1 enhance CD4<sup>+</sup> T<sub>H</sub>1 cell help for CD8 T cells, but may also facilitate killing of infected MHC II**+** cells. CD4**+** T cells with CTL function have recently been identified in various cancers that can target MHC II<sup>+</sup> tumors, including melanoma and bladder cancer<sup>48,49</sup>. Thus, it is interesting to speculate that anti-PD-1/L1 restoration of cytolytic CD4**+** T cell function may be a mechanism of action of these therapies towards MHC II**+** tumors, and may at least partially drive the high response rates to anti-PD-1 therapy in Hodgkin's lymphoma (a B cell tumor) where the tumors are often largely MHC I negative and response rates are correlated with MHC class II expression $14,15$ . Although the ability of PD-L1 blockade to restore CD8 CTL killing during chronic viral infection undoubtedly accounts for much of the therapy's efficacy in lowering viral titers, we postulate that CD4**+** CTL killing complements and likely further enhances the cytotoxicity potential of anti-PD-L1 therapy, particularly through targeting of virus-infected MHC II**<sup>+</sup>** antigen presenting cell (APC) populations. Thus, these data high-light that the suppression of CD4**+** CTL killing is a CD4**+** T cell dysfunction during chronic infection regulated by PD-L1, and that blocking PD-L1 reprograms and functionally restores CD4**+** CTL killer cells. Ultimately, these mechanisms have important implications for multiple therapeutic contexts of anti-PD-L1 therapy.

### **Methods**

#### **Mice.**

All mice used for experiments were between 6 and 10 weeks old at the initiation of the experiment. Female C57BL/6 mice (CD45.2**+**) were purchased from the Princess Margaret Cancer Center (PMCC) or The Jackson Laboratory. LCMV-GP<sub>61-80</sub>-specific CD4<sup>+</sup> TCR transgenic (SMARTA; CD45.1<sup>+</sup>) mice have been described previously<sup>18</sup> and were bred at PMCC.  $PdcdI^{-/-}$  mice were purchased from The Jackson Laboratory and subsequently crossed to SMARTA mice to generate PD-1−/− SMARTA mice. These mice were then bred at PMCC.  $β_2M^{-/-}$  mice and Foxp3<sup>DTR</sup> mice were purchased from The Jackson Laboratory. All mice were housed under specific pathogen-free conditions. Mice were sex and age matched for experiments. Mouse handling conformed to the experimental protocols approved by the OCI Animal Care Committee at PMCC/University Health Network. No statistical tests were used to predetermine sample sizes. Because the models are well established, sample sizes were chosen based on previous studies of our own and by others in the field $50,51$ . Group numbers in each experiment are described in the figure legends.

#### **LCMV infection and T cell adoptive transfer.**

Mice were infected i.v. via the retro-orbital sinus with  $2 \times 10^6$  plaque-forming units (p.f.u.) of LCMV-Cl13.  $2 \times 10^5$  p.f.u. of LCMV-Armstrong was injected intraperitoneally (i.p.) into mice as a control for the in vivo CTL assay. Virus stocks were prepared and viral titers were

quantified as described previously18. LCMV-specific CD4**+** SMARTA T cells were isolated from the spleens of transgenic mice by negative selection (StemCell Technologies). Then 3,000 CD45.1**+** SMARTA cells (donors) were transferred i.v. into the retro-orbital sinus of naïve CD45.2**+** C57BL/6 mice (recipients) that were then infected with LCMV-Cl13 one day later.

#### **In vivo antibody administration.**

For in vivo PD-L1 blockade experiments, 250 μg of anti-PD-L1 (10 F.9G2) or isotype control (LTF-2) antibody (BioXcell) was administered i.p. beginning 25 days after cell transfer, and then every 3 days thereafter, as described in the figure legends. Allocation of infected mice to treatment groups was random. Mice were killed 60 h following the first antibody treatment or one day after the third antibody treatment. In some experiments mice were injected i.v. with 3 µg of Thy1.2 fluorescein isothiocyanate antibody and killed 5 min later to examine intravascular versus extravascular localization of cells in the various organs.

#### **FTY720 treatment and Treg cell depletion.**

FTY720 was reconstituted in saline and i.p. injected into mice at a dose of 1 mg  $kg^{-1}$  daily starting 1 day before the first anti-PD-L1 treatment (that is, day 24 after infection) until the time of death. For T<sub>reg</sub> depletion mice were injected with 50 µg kg<sup>-1</sup> of diphtheria toxin at days 23 and 24 after LCMV-Cl13 infection and then every 3 days (day 27 and day 30) until mice were killed on day 33.

#### **Time-of-flight mass cytometry.**

The CyTOF antibody panel is listed in Supplementary Table 1. Purified unconjugated antibodies were labeled with metal tags at the SickKids-UHN Flow and Mass Cytometry Facility using the MaxPar Antibody Labeling Kit from Fluidigm. Directly conjugated antibodies were purchased from Fluidigm. All working antibody concentrations were determined by titration.

For staining, single-cell suspensions from individual samples were first stained for 15 min at room temperature (20 °C) with antibodies that did not perform well after fixation. The samples were then washed with PBS and pulsed with 12.5 μM cisplatin (BioVision) in PBS for 1 min at room temperature (20 °C) before quenching with CyTOF staining media (Mg**+**/Ca**+** HBSS containing 2% fetal bovine serum (FBS) (Multicell), 10 mM HEPES (pH 7.3; Corning), and FBS underlay. Cells were then fixed for 12 min at rom temperature (20 °C) with transcription factor fixative (eBiosciences) and permeabilized, and individual samples were barcoded before being combined using the 20-Plex Pd Barcoding Kit according to the manufacturer's instructions (Fluidigm). Combined samples were resuspended in staining media containing metal-tagged surface antibodies (Supplementary Table 1) and Fc block for 30 min at 4 °C. Cells were then permeabilized and stained with metal-tagged intracellular antibodies using the Foxp3 Transcription Factor Staining Kit (eBiosciences) according to the manufacturer's instructions. Cells were then incubated overnight in PBS (Multicell) containing 0.3% (w/v) saponin, 1.6% (v/v) paraformaldehyde (Polysciences Inc.) and 1 nM iridium (Fluidigm). Cells were then washed and kept in PBS with 1.6% paraformaldehyde in 4 °C for approximately 1 week until acquisition. Cells

were analyzed on a Helios or Helios2 mass cytometer (Fluidigm) at Sick Kids-UHN Flow and Mass Cytometry Facility. EQ Four Element Calibration Beads (Fluidigm) were used to normalize signal intensity over time on CyTOF software version 6.7. FCS files were manually de-barcoded and analyzed using Cytobank 6.2 (Cytobank, Inc).

Heatmaps were plotted in R using the viridis color package and the gplots package. Arcsinhtransformed median of spectral indices (MSI) values were used to generate the heatmaps. Naïve cell data in heatmaps were obtained from clustering total CD4**+** T cells from the same experiments as the virus-specific T cells and graphing MSIs of the naïve cluster defined as PD-1-neg, CD44lo, TCF-1hi and CD127hi. The R implementation of UMAP ( $k = 100$ ) and the PhenoGraph algorithm<sup>52</sup> were used for cluster analysis of arcsinh-transformed CyTOF data. Arcsinh cofactors were manually determined by staining intensity. Marker channels used to cluster each of the cell populations can be found in Supplementary Tables 2 and 3. For clustering, equal sampling of cells was performed on each of the time points based on the lowest common denominator of all groups before clustering. Owing to lower overall numbers of SMARTAs, all cells were used for clustering and the numbers displayed in UMAPs were balanced to accurately display the data. Differential states and differential abundance of clusters were calculated using the limma and edgeR tests respectively, through the "diffcyt" R package and plotted using ggplot2 (ref.  $53$ ). The R package "destiny"<sup>24</sup> was used to make diffusion maps and do the pseudotime analyses of SMARTA cells.

#### **Flow cytometry and intracellular cytokine staining.**

Single-cell suspensions were prepared from organs and were stained ex vivo using antibodies to CD4 (GK1.5), CD45.1 (A20), SLAMF1 (TC15-12F12.2), CXCR5 (2G8) and B220 (RA3-6B2), all purchased from BioLegend. Staining for Ki67 (35/Ki-67 RUO) (BD Biosciences) and Nur77 (12.14) (eBiosciences) was performed as directed using the Foxp3 Transcription Factor Staining kit (eBiosciences). Samples were run on a FACS Verse or a FACS Lyric (BD Biosciences) and data analyzed using Flow Jo software (v.9 or v.10; Treestar).

For cytokine quantification, splenocytes were restimulated for 5 h at 37 °C with 5 μg ml<sup>-1</sup> of MHC class II-restricted LCMV peptide GP<sub>61-80</sub> in the presence of 50 U ml<sup>-1</sup> recombinant murine IL-2 and 1 mg ml−1 brefeldin A (Sigma). Following the 5 h in vitro restimulation, cells were stained with the fixable viability stain zombie aqua (BioLegend), extracellularly stained as above with CD4**+**, CD45.1**+**, and then fixed, permeabilized (BioLegend cytokine staining kit) and stained with IFN-γ (XMG1.2), TNF-α (MP6-XT22) and IL-10 (JES5-16E3) (BioLegend).

#### **Single-cell RNA-sequencing.**

SMARTA T cells were transferred into naïve mice that were infected with LCMV-Cl13 a day later. Anti-PD-L1-blocking antibody or isotype control antibody was administered i.p. beginning 25 days after infection and subsequently on day 28 and day 31 for a total of three treatments. Mice were killed following the third treatment (day 33 post infection) and splenocytes from four anti-PD-L1 treated mice or four isotype-treated mice were separately pooled and B cell depleted with anti-CD19 beads (Miltenyi). Single-cell suspensions were

then stained for virus-specific SMARTA T cells using CD4 and CD45.1 and FACSorted on a Moflo Astrios (Beckman Coulter) or a BD FACSAria Fusion cell sorter (Schematic for Sort is shown in Extended Data Fig. 8). Sorted anti-PD-L1 treated and isotype-treated SMARTA cells were then washed twice with PBS + 0.04% BSA and mixed with  $10\times$ Genomics Chromium single-cell RNA master mix and loaded onto a 10× chromium chip according to the manufacturer's protocol to obtain single-cell complementary DNA (cDNA). Library generation was performed following the Chromium Single Cell 3ʹ Reagents Kits v.2 User Guide: CG00052 Rev B. Each library was sequenced on the Illumina HiSeq 2500 platform to achieve an average of 50,000 reads per cell. Sequencing was done at the Princess Margaret Genomics Center. Plasma LCMV titers were measured to confirm that virus was not decreased at the time of death.

For the anti-PD-L1 and isotype-treated SMARTA samples raw sequencing data was processed using Cell Ranger (v.1.3.1, 10× Genomics) to generate expression matrix of RNAs (gene-level counts) for each cell in each sample. Cell Ranger identified 965 cells for the isotype sample and 1,743 cells for the anti-PD-L1 sample. All subsequent downstream analysis was performed in the R statistical programming language using the Seurat (v.3.1.0) package<sup>54</sup>. For various quality control steps involving cell filtering, normalization and removal of technical variation, we merged both samples into a single Seurat object. In total, 179 low-quality cells were filtered out using selected threshold for nUMI = 500, nGene  $200$  and  $\langle 2,500, \log_{10}$  (GenesPerUMI)  $> 0.80$ , mitochondrial ratio  $< 5$  and genes with zero counts. The final dataset used for analysis consisted of 2,529 cells (965 cells for isotype and 1,618 cells for anti-PD-L1) and 10,575 genes. The SCTransform function was used to normalize data and regress out factors related to mitochondrial and cell-cycle genes. To identify clusters, we performed an integrated analysis of the cells from isotype and anti-PD-L1 samples using 3,000 highly variable genes and the first 30 principal components. Eight clusters were identified at resolution 0.4. Differential expression analyses for the eight clusters were performed using the MAST function in the Seurat package. Cluster 2 volcano plot was made using the R package Enhancedvolcano.

Predicted upstream regulator analysis of differentially expressed genes was performed by Ingenuity Pathway Analysis software (Qiagen). Gene Set Enrichment Analysis was performed<sup>55,56</sup> on the Enrichment Map gene set "Mouse\_GOBP\_AllPathways\_no\_GO\_iea\_August\_01\_2017\_symbol.gmt"<sup>57</sup> and ImmuneSigDB<sup>55,58</sup> using DE genes preranked by P value between anti-PD-L1 and isotype treatments on total cells and in each individual cluster. ImmuneSigDB gene lists were converted from human genes to orthologous mouse genes using Ensembl BioMart<sup>59</sup>.

The SCENIC R package  $(v.1.2.4)^{38}$  was used to assess regulon activity on a cellular level. A regulon is formed of a transcription factor (TF) and its putative direct targets. Briefly, SCENIC defines coexpressed modules based on TF and gene coexpression using the GENIE3 R package (v.1.12.0). Regulons are then defined by excluding indirect targets from the coexpressed modules based on enrichment of DNA TF-binding motifs in targets using the RcisTarget R package (v.1.10.0).

Finally, a regulon activity score (RAS) is calculated for each regulon using the AUCell R package (v.1.13.1) based on the enrichment of a regulon for genes located at the top of a list of all genes ranked by their expression in decreasing order. SCENIC was run on 7,669 genes having at least 75 (3 UMI  $\times$  25 (1%) cells) counts per cell, expressed in at least 1% of isotype and anti-PD-L1 treated cells, and available in the mm10 mouse RcisTarget database. SCENIC identified 158 regulons in 2,494 cells out of 3,514 coexpressed modules, of which 107 regulons were active in more than 1% of isotype and anti-PD-L1 treated cells. Regulon RAS average was calculated for cells in each Seurat cluster in isotype and anti-PD-L1 treated groups. The z-scores are then calculated by regulon (row normalized). Heatmaps were generated using the pheatmap R package (v.1.0.12).

#### **Bulk RNA-sequencing of CD4+ TH1 and TFH cells during acute LCMV-Armstrong infection.**

SMARTA T cells were transferred into naïve mice that were infected i.p. with  $2 \times 105$ p.f.u. of LCMV-Armstrong a day later. Seven days after infection, mice were killed and splenocytes from ten mice each pooled into three groups for separate replicates and B cell depleted with anti-CD19 beads (Miltenyi). Single-cell suspensions were then stained for virus-specific CD4<sup>+</sup> T<sub>H</sub>1 and T<sub>FH</sub> SMARTA cells using CD4<sup>+</sup>, CD45.1<sup>+</sup>, SLAMF1 and CXCR5, and FACSorted on a Moflo Astrios (Beckman Coulter) directly into RLT buffer (Qiagen). RNA was isolated using a single-cell RNA purification kit (Norgen Biotech) according to manufacturer's instructions. SMART-Seq v.4 Ultra Low Input RNA Kit for Sequencing (Clontech) was used per manufacturer's instructions for amplification of RNA and subsequent cDNA synthesis. All samples proceeded through NexteraXT DNA Library Preparation (Illumina) using NexteraXT Index Kit V1 or V2 Set A (Illumina) following manufacturer's instructions. A portion of this library pool was sent for sequencing on an Illumina NextSeq HighOutput, single read at the Princess Margaret Genomics Centre. An average of  $400 \times 10^6$  reads were obtained per pool, with an average of  $40M$  reads/sample across the entire data set.

Illumina reads were aligned to the *Mus musculus* GRCm38 genome build 88 (ref.  $^{60}$ ) using HISAT2 (ref.  $61$ ). Alignments were compressed and sorted using SAMtools $62$ . The alignments were quantified using HTSeq<sup>63–65</sup> to obtain gene counts. Differential analysis was conducted using edge $R^{64,65}$  with modified code from the rnaseq.wiki protocol<sup>66</sup>. Lowcount genes were excluded from the analysis if at least three samples did not have at least one count per million reads mapped (CPM) for that gene. Gene counts were normalized using Trimmed Mean of M values normalization<sup>55,58,67</sup>. Figure was plotted in R using the ggplot2 package<sup>68</sup>.

#### **In vivo CTL assay.**

Splenocytes from naïve  $\beta_2M$  knockout ( $\beta_2M^{-/-}$ ) mice were isolated for target cells and pulsed with either 5 μg ml<sup>-1</sup> of LCMV-specific GP<sub>61-80</sub> peptide or a nonspecific peptide (OVA323-339) and then respectively labeled with either Tag-it violet proliferation dye (BioLegend) or carboxyfluorescein succinimidyl ester (Sigma).  $GP<sub>61-80</sub>$  and OVA<sub>323-33</sub> labeled  $\beta_2M^{-/-}$  splenocytes were mixed at a ratio of 1:1 and 2 million cells were injected into either naïve mice, mice infected for 9 days with LCMV-Armstrong, or mice infected with LCMV-Cl13 that had been administered either their third anti-PD-L1 or isotype

antibody treatment a day earlier (treatment schedule described above). Eighteen hours after target cell transfer, mice were killed and the ratio of specific (Tag-it) to nonspecific (carboxyfluorescein succinimidyl ester) killing of B220**+** target cells (MHC II positive) or CD4**+** target cells (MHC II negative) was subsequently analyzed by flow cytometry in the spleen. The percentage of specific killing was determined by the following equation:  $[1 -$ (ratio of Gp66 to OVA)]  $\times$ 100.

#### **Data exclusion and blinding.**

No data was excluded from this study. On some occasions, SMARTA cells were not detected in recipient mice at the experimental time point, and these were excluded from the analysis (that is, if there are no SMARTA cells, we cannot phenotype or analyze them). Note, this occurred in both isotype- and anti-PD-L1 treated mice, indicating it is not a result of a specific treatment. Data collection and analysis were not performed blind to the conditions of the experiments.

#### **Statistical analysis.**

All statistical parameters are described in the figure legends. Student's  $t$ -tests (two-tailed, unpaired) or one-way ANOVA (two-tailed, unpaired) were performed using GraphPad Prism v.6 (GraphPad Software). Data distribution was assumed to be normal but this was not formally tested. As a result, individual data distribution (individual data points) are shown. In the line and bar graphs the error bars indicate standard deviation (s.d.). In the box and whisker plots the box represents the median and upper and lower quartiles and the whiskers the minimum and maximum values.

#### **Reporting Summary.**

Further information on research design is available in the Nature Research Reporting Summary linked to this article.







**Extended Data Fig. 2 |. Enhancement of virus-specific CD4+ TH1 cells by PD-L1 blockade occurs prior to decreased virus titers.**



**Extended Data Fig. 3 |. Pre-therapy cycling CD4+ SMARTA T cell populations are targets of anti-PD-L1 blockade.**



**Extended Data Fig. 4 |. PD-L1 blockade targets cycling, TH1-phenotype Treg cells.**



**Extended Data Fig. 5 |. Single cell transcriptomic analyses of virus-specific CD4+ T cells following PD-L1 blockade.**



**Extended Data Fig. 6 |. Pathway analysis of CD4+ SMARTA T cells following PD-L1 blockade.**



**Extended Data Fig. 7 |. Cytotoxic gene expression in all SMARTA clusters from single cell analysis.**



**Extended Data Fig. 8 |. Flow gating scheme for sorting.**

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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# **Data availability**

The RNA-seq data generated in this paper have been deposited in the Gene Expression Omnibus (GEO) database under accession number GSE163345. Source data are provided with this paper.

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Fig. 1 |. PD-L1 blockade specifically amplifies and functionally enhances  $CD4^+$   $T_{\rm H}$ 1 cells.

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**Fig. 2 |. Pretherapy cycling CD4+ SMARTA T cells are expanded upon PD-L1 blockade.**



Fig. 3 |. PD-L1 blockade specifically expands and activates  $T_H$ 1-like  $T_{reg}$  cells.

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**Fig. 4 |. PD-L1 blockade expands and induces tissue infiltration of Treg cells in nonlymphoid organs.**

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Fig. 5  $\vert$ . PD-L1 blockade enhances  $T_H1$  gene programs and terminal differentiation of  $T_H1$  cells.



**Fig. 6 |. PD-L1 blockade reorients intracellular interferon and TCR signaling.**



**Fig. 7 |. PD-L1 blockade restores virus-specific CD4 <sup>+</sup> CTL function.**