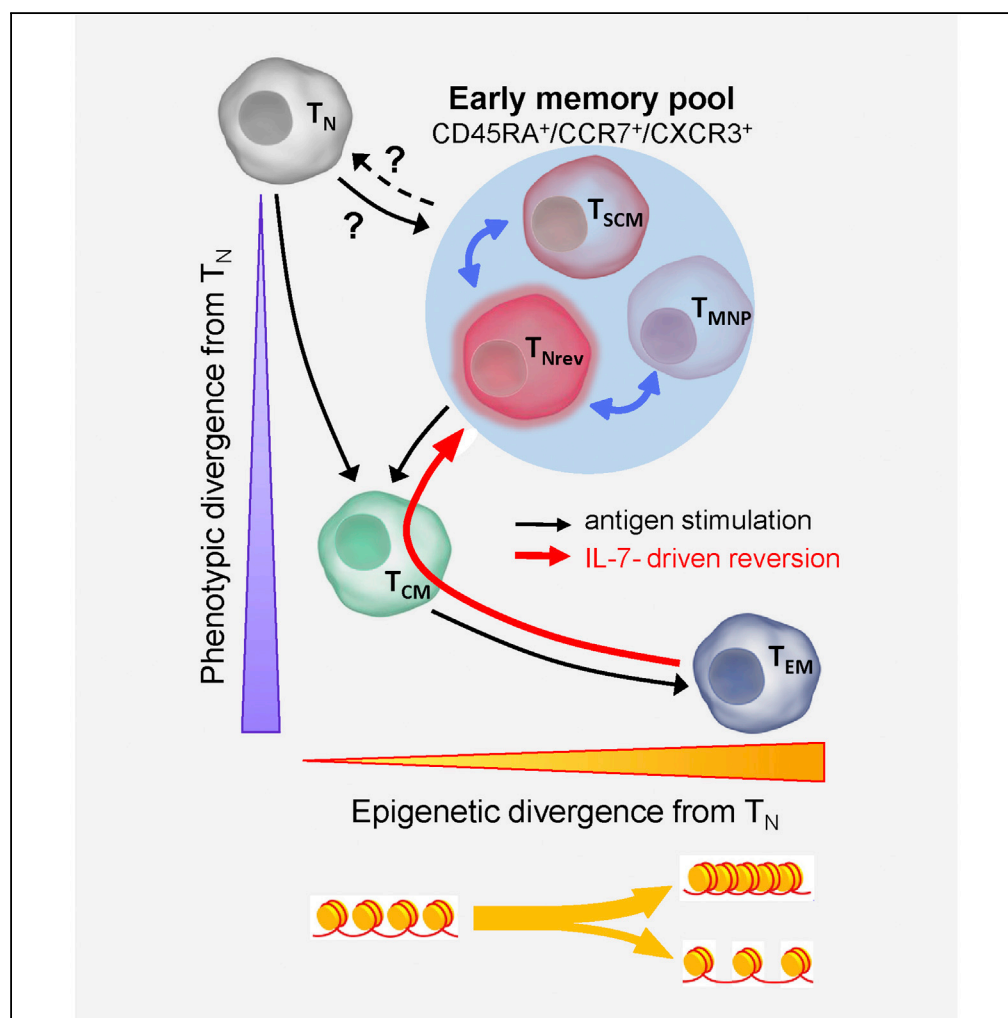


## Article

# Homeostatic Cytokines Drive Epigenetic Reprogramming of Activated T Cells into a “Naive-Memory” Phenotype



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## HIGHLIGHTS

$\gamma$ -chain cytokines revert newly differentiated  $CD8^+$  T cells to a naive-like phenotype

These “naive-revertant” are primed for secondary challenge

Their chromatin landscape is reminiscent of memory cells

Specific signaling pathways and transcription factors are involved

## DATA AND CODE

AVAILABILITY  
GSE114812

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## Article

# Homeostatic Cytokines Drive Epigenetic Reprogramming of Activated T Cells into a “Naive-Memory” Phenotype

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## SUMMARY

**Primary stimulation of T cells is believed to trigger unidirectional differentiation from naive to effector and memory subsets. Here we demonstrate that IL-7 can drive the phenotypic reversion of recently differentiated human central and effector memory CD8<sup>+</sup> T cells into a naive-like phenotype. These “naive-revertant” cells display a phenotype similar to that of previously reported stem cell memory populations and undergo rapid differentiation and functional response following secondary challenge. The chromatin landscape of reverted cells undergoes substantial epigenetic reorganization with increased accessibility for cytokine-induced mediators such as STAT and closure of BATF-dependent sites that drive terminal differentiation. Phenotypic reversion may at least partly explain the generation of “stem cell memory” CD8<sup>+</sup> T cells and reveals cells within the phenotypically naive CD8<sup>+</sup> T cell pool that are epigenetically primed for secondary stimulation. This information provides insight into mechanisms that support maintenance of T cell memory and may guide therapeutic manipulation of T cell differentiation.**

## INTRODUCTION

The development of T cell memory is essential for long-term health but it remains uncertain how this population is maintained over the many decades of human lifespan. Current models of CD8<sup>+</sup> T cell differentiation propose a unidirectional and irreversible pathway whereby initial antigen stimulation triggers sequential differentiation of naive (T<sub>N</sub>) cells into central memory (T<sub>CM</sub>), effector memory (T<sub>EM</sub>), and effector (T<sub>Eff</sub>) T cells (Klebanoff et al., 2006). T cells gradually acquire increasing effector function but this is associated with a progressive reduction in the capacity for differentiation and self-renewal, i.e., “stemness.” In settings of persistent antigenic stimulations T cells may progressively lose effector functions and proliferative capacity such that they eventually become exhausted.

Two subsets of phenotypically naive CD8<sup>+</sup> T cells with features of memory cells have recently been described. “T-memory stem cells” (T<sub>SCM</sub>), which display enhanced capacity for self-renewal and multipotent proliferative potential (Gattinoni et al., 2011), are believed to be minimally differentiated and located between T<sub>N</sub> and T<sub>CM</sub> in the differentiation pathway (Gattinoni et al., 2017). “Memory T cells with naive phenotype” (T<sub>MNP</sub>) also exhibit broad polyfunctional capability (Pulko et al., 2016) and are thought to be functionally imprinted at an early stage of differentiation between CD8<sup>+</sup> T<sub>N</sub> and T<sub>CM</sub> subsets. Despite sharing many characteristics, T<sub>SCM</sub> and T<sub>MNP</sub> differ in their extended phenotype and it is uncertain if they represent distinct and stable subsets or derive from a common precursor with phenotypic plasticity. Although CD8<sup>+</sup> T<sub>SCM</sub> can be produced *in vitro* by activating T<sub>N</sub> cells in the presence of interleukin (IL)-7, IL-21, and the glycogen synthase-3β inhibitor TWS119 9 (Sabatino et al., 2016), the physiological mechanisms leading to the generation of both these cells and T<sub>MNP</sub> are largely unknown.

Given the importance of cytokines as key regulators of T cell-mediated immunity, we analyzed the effect of different cytokines on T cell differentiation after primary stimulation, using T cells from human cord blood (CB), which are unlikely to have encountered antigen and therefore have a very low frequency of T<sub>SCM</sub> (Gattinoni et al., 2011). We observed that recently differentiated CD8<sup>+</sup> memory T cells can undergo lineage reversion to a naive-like phenotype when exposed to γ-chain cytokines and that these naive-revertant cells share extensive phenotypic and functional characteristics with both T<sub>SCM</sub> and T<sub>MNP</sub>. This work describes a new pathway of T cell differentiation and provides a unifying theory for the generation of T cells with a “naive-memory” profile.

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## RESULTS

### IL-7 Induces Recently Differentiated CD8<sup>+</sup> Memory T Cells to Revert to a Naive-like Phenotype

CB mononuclear cells (CBMCs) were activated with anti-CD3 plus IL-2, and the differentiation stage of CD8<sup>+</sup> T cells was evaluated by CD45RA and CCR7 co-expression (Klebanoff et al., 2006). As expected, activation induced an expansion of T<sub>CM</sub> (CD45RA<sup>-</sup>/CCR7<sup>+</sup>) and T<sub>EM</sub> (CD45RA<sup>-</sup>/CCR7<sup>-</sup>) subsets with a concurrent reduction in T<sub>N</sub> (CD45RA<sup>+</sup>/CCR7<sup>+</sup>) (Figures 1A and 1B). T<sub>Eff</sub> (CD45RA<sup>+</sup>/CCR7<sup>-</sup>) were not generated in significant number and were not considered further.

In order to investigate the role of cytokines in determining the fate of recently differentiated memory CD8<sup>+</sup> T cells, IL-7 was added to the culture medium when the proportion of CD8<sup>+</sup> T<sub>N</sub> dropped below 20% of the CD8<sup>+</sup> population, typically around 1 week after activation ( $6.7 \pm 1.9$  days, mean  $\pm$  1 SD, n = 50). No further activation stimulation was given. In the first 3 days following addition of IL-7 the percentage of CD8<sup>+</sup> T<sub>N</sub> continued to diminish, reaching a nadir of  $8.4\% \pm 6.40$  (Figure 1B). However, with continuing IL-7 incubation the great majority of CD8<sup>+</sup> T cells started to re-express CD45RA and reverted back to a phenotype resembling T<sub>N</sub> and characterized by co-expression of CD45RA, CCR7, CD62L, and CD27 and loss of CD45RO expression (Figures 1A and S1A). We termed these cells that reverted to a naive-like phenotype as “T naive-revertant” (T<sub>Nrev</sub>). This re-acquisition of a naive-like phenotype by CD8<sup>+</sup> memory T cells reached a plateau by 13–28 days after initial activation ( $20 \pm 4.7$  days) and typically represented over 70% of the CD8<sup>+</sup> T cell population (mean  $71\% \pm 12$ , range 45%–95%). As such, this value was only slightly below the mean of 87% of CD8<sup>+</sup> T<sub>N</sub> at day 0 ( $\pm 5.8$ , range 74–98). All samples followed a similar pattern, although there was variation both in the time taken to reach the peak T<sub>Nrev</sub> level and in the magnitude of the T<sub>Nrev</sub> population at plateau (Figure 1B). These differences in the percentage of cells with naive phenotype between day 0 and nadir, and between nadir and plateau, were highly significant ( $p = 1.99 \times 10^{-50}$  and  $p = 2.69 \times 10^{-38}$ , respectively, by paired t test).

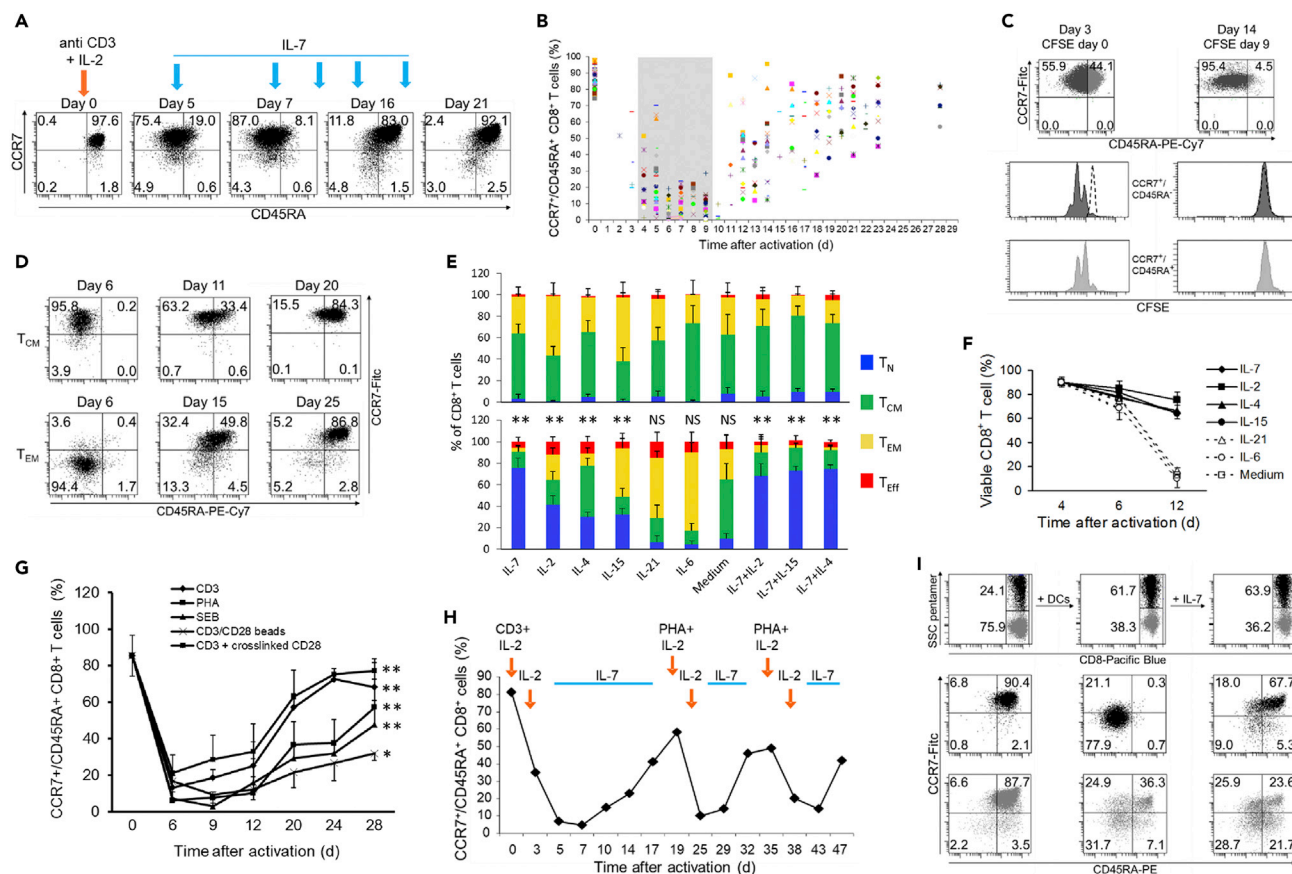
To demonstrate that the phenotypic reversion of differentiated T cells was not due to selective death or proliferation of individual T cell subsets, we enumerated the cells within each cell subset and monitored their proliferation. The total number of all cell subsets before and after reversion remained largely unchanged (Table S1), and no cell proliferation was detected after the addition of IL-7 and during the period of phenotypic reversion (Figure 1C). To further confirm that the phenomenon was due to modulation of cellular phenotype, recently differentiated CD8<sup>+</sup> T<sub>CM</sub> and T<sub>EM</sub> were purified, incubated with IL-7, and tracked. Phenotypic reversion was again demonstrated for over 80% of the purified T<sub>CM</sub> and T<sub>EM</sub> (Figure 1D).

### T<sub>Nrev</sub> May Undergo Several Rounds of Differentiation and Reversion

We next assessed whether this property was unique to IL-7 or shared by other cytokines. Recently differentiated CBMCs were incubated with single and multiple combinations of the  $\gamma$ -chain cytokines IL-2, IL-7, IL-15, IL-4, and IL-21. IL-6, an inflammatory cytokine, was also incorporated.

Phenotypic reversion was observed with several of these cytokines, but IL-7 was the most potent agent (Figure 1E). Interestingly, CD8<sup>+</sup> T cells cultured with IL-6 or IL-21 were driven toward a more differentiated phenotype with a substantial increase in T<sub>Eff</sub> cells. No synergistic effect was observed when IL-7 was administered together with IL-2, IL-4, or IL-15. In addition, the ability of individual cytokines to promote dedifferentiation to T<sub>Nrev</sub> cells was correlated with their ability to maintain CD8<sup>+</sup> T cell survival *in vitro* (Figure 1F), whereas IL-6, IL-21, or medium alone led to substantial cell death. This suggests that reversion may be a default physiological program of recently differentiated CD8<sup>+</sup> T cells when a survival stimulus is provided.

Phenotypic reversion also takes place following differentiation induced by mitogenic stimuli other than soluble anti-CD3 (Figure 1G). The percentage of differentiated CD8<sup>+</sup> T cells undergoing IL-7-dependent phenotypic reversion after activation with phytohemagglutinin (PHA) and staphylococcus enterotoxin B (SEB) was similar to those following activation with anti-CD3. Activation with CD3/CD28 beads led to a smaller proportion of differentiated cells reverting to a naive phenotype, but we were unable to fully remove the beads, some of which were still attached to the cells when IL-7 was added, and it is likely that the resulting continuous antigen stimulation explains the lesser reversion achieved. However, the kinetics of reversion were similar demonstrating that co-stimulation does not prevent phenotypic reversion.



**Figure 1. IL-7 Induces Reversion of Recently Differentiated Memory CD8<sup>+</sup> T Cells to a Naive-like Phenotype**

(A) Flow cytometric analysis of phenotypic changes in CD8<sup>+</sup> T cells after activation and successive incubation with 25 ng/mL IL-7. CBMCs were activated with anti-CD3 plus IL-2, and when the percentage of CD8<sup>+</sup> T<sub>N</sub> dropped below 20%, in this case day 5, cultures were maintained in IL-7. Numbers indicate the percentage of cells in each quadrant. Single representative experiment out of 50.

(B) Kinetics of phenotype reversion of CD8<sup>+</sup> T cells from the 50 different CB samples. Each symbol represents one sample. The shaded area indicates the interval of time when IL-7 was added for the first time.

(C) CD8<sup>+</sup> T cell proliferation after activation and IL-7 administration. CBMCs were stained with CFSE either before activation (left panels) or at day 9, during phenotype reversion (right panels). At the indicated time points, cell phenotype and CFSE content were assessed for T<sub>N</sub> (light gray dots) and T<sub>CM</sub> (dark gray dots). Dashed lines indicate basal content in CFSE. Single representative experiment out of three.

(D) Flow cytometry evaluation of IL-7-dependent phenotype reversion in recently differentiated T<sub>CM</sub> and T<sub>EM</sub>. After activation T<sub>CM</sub> and T<sub>EM</sub> were negatively selected. The two cell subpopulations were then incubated with IL-7 and monitored for phenotypic changes over time. Single representative experiment out of three, for each subset.

(E) The effect of different cytokines on phenotype reversion. CBMCs were activated, and when the percentage of CD8<sup>+</sup> T<sub>N</sub> dropped below 20% the indicated cytokines were added. The percentage of the cells in the different subsets is shown when the percentage of CD8<sup>+</sup> T<sub>N</sub> reached the nadir (upper panel) and afterward, when it reached the plateau (lower panel). Data from six samples. Paired t test analysis between the T<sub>N</sub> levels at nadir and plateau. \*\* = p < 0.001.

(F) Viability of cells incubated with different cytokines. Activated CBMCs were incubated from day 4 with each cytokine or medium, and CD8<sup>+</sup> T cell viability was evaluated by flow cytometry using 7-AAD uptake. Data are represented as means ± 1SD of three samples.

(G) The kinetics of phenotype reversion of CD8<sup>+</sup> T cells activated with different artificial stimuli. Data are represented as means ± 1SD of three samples. Paired t test analysis between the T<sub>N</sub> levels at nadir and plateau. \* = p < 0.05, \*\* = p < 0.001.

(H) The kinetics of phenotype reversion of CD8<sup>+</sup> T cells undergoing successive cycles of activation/IL-7 incubation. Newly generated CD8<sup>+</sup> T<sub>Nrev</sub> cells were twice re-stimulated with PHA and induced to revert twice with IL-7 when the percentage of T<sub>N</sub> dropped below 20%. Single representative experiment out of three.

(I) Flow cytometry analysis of phenotype changes of CD8<sup>+</sup> T<sub>Nrev</sub> upon activation with the cognate antigen. CB T lymphocytes were activated, retrovirally transduced with the SSC-TCR, and induced to revert their phenotype with IL-7 (left panels). Afterward, cells were incubated with peptide-pulsed DCs (central panels). IL-7 was then added again, driving the transduced cells to revert their phenotype (right panels). Plots were gated on CD8<sup>+</sup> T cells. The upper panels show the percentage of transduced (black dots) and non-transduced (gray dots) CD8<sup>+</sup> T cells.

We further assessed whether cells could undergo more than one cycle of phenotypic reversion. Since serial rounds of anti-CD3 stimulation led to a high rate of cell death, PHA was used for two further rounds of activation, each followed by IL-7 incubation (Figure 1H). Phenotypic reversion was observed after each cycle of

activation and IL-7 treatment, indicating that CD8<sup>+</sup> T<sub>N</sub> can undergo repeated cycles of differentiation and reversion.

In order to demonstrate that phenotypic reversion is also possible after activation with cognate antigen, CBMCs were transduced with a gene encoding a T cell receptor (TCR) specific for a peptide from the Epstein-Barr virus (EBV) LMP2 protein (Frumento et al., 2013). Following activation and retroviral transduction, cells acquired a predominantly T<sub>CM</sub>/T<sub>EM</sub> phenotype but reverted to T<sub>Nrev</sub> when incubated with IL-7. Cells were then re-challenged with peptide-pulsed autologous dendritic cells (DCs) and underwent differentiation again to CD8<sup>+</sup> T<sub>EM</sub> within 5 days (Figure 1I). At this point IL-7 was re-added, and after a further 9 days a second reversion to T<sub>Nrev</sub> was attained, demonstrating that phenotypic reversion is also possible after stimulation with cognate antigen presented by professional antigen-presenting cells.

### CD8<sup>+</sup> T<sub>Nrev</sub> Proliferate and Differentiate Rapidly into Functional Effector Cells following Secondary Stimulation

As T<sub>Nrev</sub> are antigen-experienced cells that have previously undergone differentiation and expansion we were interested to assess their proliferative potential when compared with primary T<sub>N</sub>. After re-stimulation T<sub>Nrev</sub> differentiated into memory subsets more rapidly than T<sub>N</sub> and exhibited a higher proliferation rate (Figures 2A and 2B). T<sub>Nrev</sub> also rapidly acquired effector function, and when EBV-specific TCR-transduced T<sub>Nrev</sub> were re-stimulated with peptide-pulsed DCs and driven to a T<sub>EM</sub> phenotype the cells expressed perforin and granzyme B (Figure 2C) and exerted cytolytic activity against target cells (Figure 2D).

### T Cells from Cord Blood and Adult Donors Differ in Degree of Reversion and Chromatin Accessibility

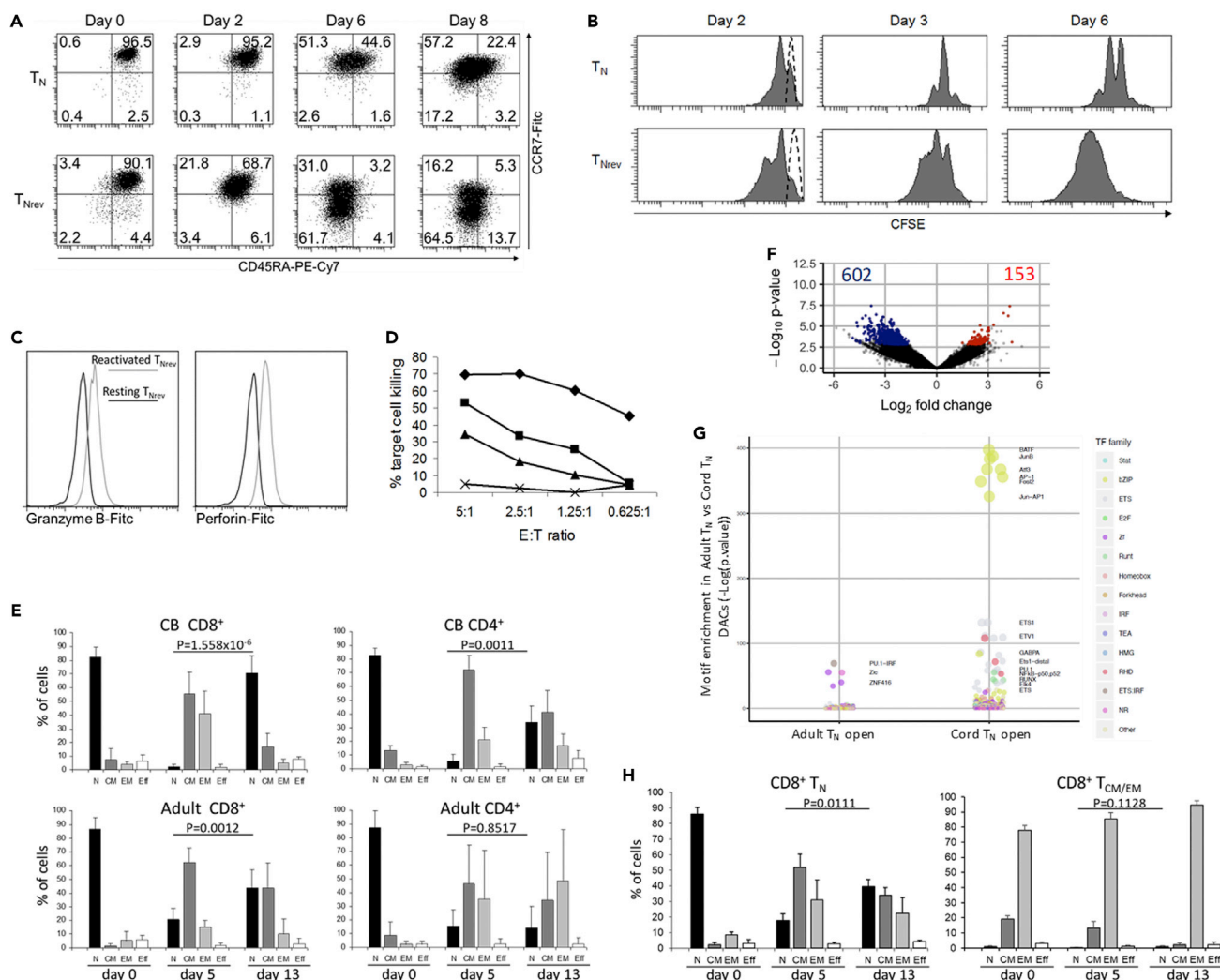
In order to demonstrate that phenotypic reversion phenomenon is not just restricted to T cells from CB we next enriched CD8<sup>+</sup> and CD4<sup>+</sup> T<sub>N</sub> cells from the blood of adult donors and compared their ability to revert to T<sub>Nrev</sub> following *in vitro* activation (Figure 2E). Although the vast majority of CB-derived CD8<sup>+</sup> T cells could be induced to revert to T<sub>Nrev</sub>, this was seen in less than half of naive CD8<sup>+</sup> T cells from peripheral blood (PB) of adult donors. The reduced degree of reversion in PB cells could not be related to differences in basal phenotype as these were identical in T<sub>N</sub> cells from CB and PB (Figure S1B). Instead, a remarkable difference was found in the chromatin landscape of T<sub>N</sub> from the two sources (Figure 2F), which is predicted to influence a range of biological processes (Figure S2A). Compared with T<sub>N</sub> from PB, T<sub>N</sub> from CB showed increased accessibility to sites binding transcription factors (TFs), in particular those from the basic region/leucine zipper motif (bZIP) family, of which BATF was the one with the highest number of open binding sites (Figure 2G). Moreover, T<sub>Nrev</sub> showed more open chromatin regions annotated as regulatory sites for genes involved in TCR signaling (Figure S2B).

Only recently differentiated T<sub>CM</sub> and T<sub>EM</sub> were able to undergo reversion and not established T<sub>CM</sub> (CCR7<sup>+</sup>/CD45RA<sup>-</sup>) and T<sub>EM</sub> (CCR7<sup>-</sup>/CD45RA<sup>-</sup>) CD8<sup>+</sup> T cells from adult blood (Figure 2H). This indicates that, despite similar phenotype, the capacity for IL-7-induced dedifferentiation is observed only within recently differentiated T<sub>CM</sub> and T<sub>EM</sub> and is relatively less efficient in adult donors.

### T<sub>Nrev</sub> Phenotype Overlaps with T<sub>SCM</sub> and T<sub>MNP</sub> during *In Vitro* Culture

Using available data (Christensen et al., 2001; Hendriks et al., 2003; Hermiston et al., 2003; Ishida et al., 1992; Kim et al., 2006; O'Shea et al., 1992; Zehnder et al., 1992) we identified 28 membrane-bound proteins that exhibit a differential pattern of expression following T cell activation and differentiation. Antibodies against these proteins were then used to contrast the phenotypic profile of T<sub>N</sub> and T<sub>Nrev</sub>. The pattern of expression of integrin β7, CD25, CD127, CD95, CXCR3, and CD49d was found to discriminate between these two subsets (Figure 3A). Interestingly, CD95 and CXCR3 are also distinct markers of T<sub>SCM</sub> (Gattinoni et al., 2011) and CD49d is a marker of T<sub>MNP</sub> (Pulko et al., 2016). T<sub>Nrev</sub> and T<sub>CM</sub> are clearly distinguished by CCR7 and CD45RA expression, but additional differences were also found in the expression of CD25, CD45RO, CD69, CD95, CD120b, CD122, and PTX7 (Figures 3A and S3). These differences demonstrate that the phenotypic correlates of reversion extend substantially beyond differential expression of CCR7 and CD45RA.

We next went on to investigate the relationship between T<sub>Nrev</sub> cells and T<sub>SCM</sub> and T<sub>MNP</sub> subsets. In particular we were interested in the stability of the T<sub>Nrev</sub> phenotype and how this could be modulated by culture conditions. CD8<sup>+</sup> T<sub>Nrev</sub> cells had a very similar phenotype to T<sub>SCM</sub> and T<sub>MNP</sub>, and all three expressed a



**Figure 2. CD8<sup>+</sup> T<sub>Nrev</sub> Cells Have Excellent Differentiation and Proliferative Potential and the Amplitude of Reversion Depends on the Cell Source** (A) Flow cytometry analysis of phenotype changes in CD8<sup>+</sup> T<sub>Nrev</sub> and T<sub>N</sub> cells from the same CB sample following stimulation with PHA. Single representative experiment out of three.

(B) Flow cytometry analysis of the proliferation of CD8<sup>+</sup> T<sub>Nrev</sub> and T<sub>N</sub> cells. Cells from the samples shown in the panel above were stained with CFSE at day 0 and activated with PHA. The CFSE content in the two cell subsets is shown at the indicated time points. Dashed lines represent basal content of CFSE. Single representative experiment out of three.

(C) Flow cytometry analysis of perforin and granzyme B expression by the re-stimulated TCR-transduced CD8<sup>+</sup> T<sub>Nrev</sub>. The intracellular expression of perforin and granzyme B were assessed in T<sub>Nrev</sub> cells transduced with the SSC-TCR after re-stimulating the cells twice with cognate peptide-pulsed DCs.

(D) Cytotoxic assay of re-stimulated, SSC-specific TCR-transduced T<sub>Nrev</sub>. The T cells were incubated in a standard <sup>51</sup>Cr cytolytic assay with target cells consisting of HLA A\*1101-transduced T2 cells loaded with either 1 μg/mL (diamonds), 10 ng/mL (squares) or 1 ng/mL (triangles) of SSC peptide. The peptide solvent, i.e., DMSO, was used as control (crosses). The percentage of target cell killing at different E:T ratios is indicated.

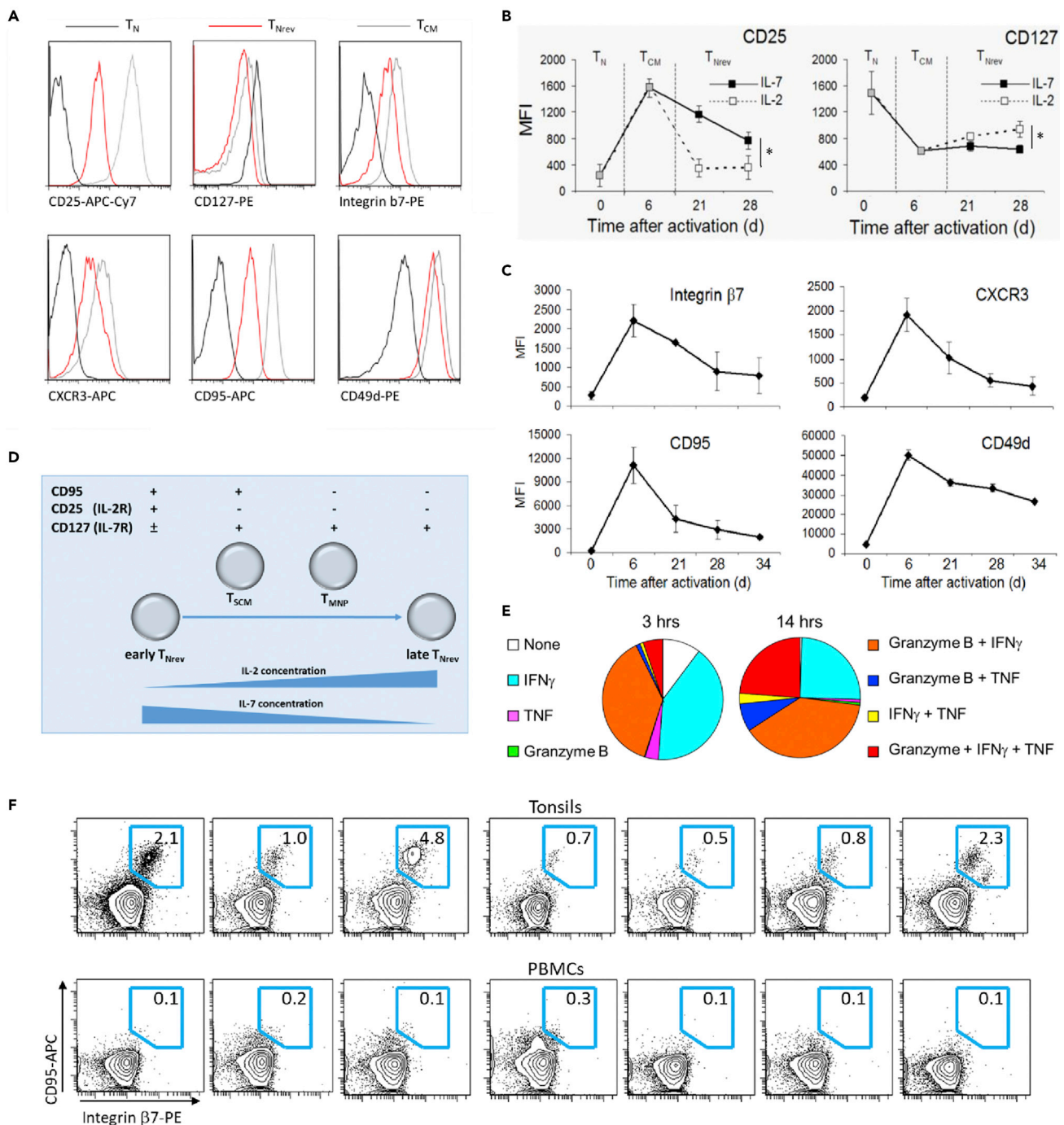
(E) T<sub>N</sub> cells were isolated from CBMCs and PBMCs, activated with PHA, and then incubated with IL-7. The percentage of cells in the different subsets was measured by flow cytometry at the indicated time points. Data are represented as mean ± 1SD of five CB samples and eight PB samples. Analysis by paired t test.

(F) Differential accessibility of peak regions identified in PB T<sub>N</sub> cells versus CB T<sub>N</sub> cells. The x axis indicates Log<sub>2</sub> fold change, and the y axis indicates -Log<sub>10</sub> p value of all peaks. Colored points indicate differentially accessible chromatin sites with inaccessible sites as blue and accessible sites as red. Data are from three CB and three PB samples.

(G) TF-binding motif enrichments at DACs more accessible in T<sub>N</sub> from PB and from CB. Significant (FDR<0.1) pathway enrichments identified within DEG lists from T<sub>Nrev</sub>.

(H) CD8<sup>+</sup> T<sub>N</sub>, T<sub>CM</sub> and T<sub>EM</sub>, were isolated from adult PB, activated with PHA, and incubated with IL-7 from day 5. The percentage of cells in the different subsets was measured by flow cytometry at the indicated time points. Data are represented as mean ± 1SD of three samples. Paired t test.

common profile of CD45RA<sup>+</sup>/CCR7<sup>+</sup>/CD27<sup>+</sup>/CD62L<sup>+</sup>/CD45RO<sup>-</sup>/CXCR3<sup>+</sup>/CD31<sup>+</sup>/CD122<sup>lo</sup>. Indeed, the only difference between early T<sub>Nrev</sub> and the other two subsets was that both T<sub>MNP</sub> and T<sub>SCM</sub> express the IL-7 receptor (CD127) and T<sub>SCM</sub> lack expression of the IL-2 receptor (CD25), whereas T<sub>Nrev</sub> exhibit a



**Figure 3.  $CD8^+$   $T_{Nrev}$  Can Acquire Phenotypic and Functional Characteristics of Other Early Memory T Cell Subsets and Are Present *In Vivo***

(A) The expression of the markers that discriminate early  $T_{Nrev}$  from  $T_N$  and recently differentiated  $T_{CM}$  was measured by flow cytometry. Single representative experiment out of three.

(B) Kinetics of CD25 and CD127 expression by  $CD8^+$   $T_{Nrev}$  in the presence of either IL-2 or IL-7. After phenotype reversion had occurred, cells were either maintained in 25 ng/mL IL-7 or switched to culture in 30 U/mL IL-2. The absence of one cytokine led to increased expression of its cognate receptor. The mean fluorescence intensity (MFI) is shown. Data are represented as means  $\pm$  1SD of three samples. Unpaired t test analysis between the MFI levels at day 28, \* =  $p < 0.05$ .

(C) Kinetics of the expression of discriminatory markers for early  $T_{Nrev}$  cells. The MFI was measured at different time points during activation and reversion. Data are represented as means  $\pm$  1SD of three samples.

(D) Scheme of the differences in phenotype between the memory  $CD8^+$  T cell subsets showing naive-like phenotype.

**Figure 3. Continued**

(E)  $T_{Nrev}$  were re-stimulated with PMA plus ionomycin, and the percentages of cells expressing granzyme B, IFN $\gamma$ , TNF- $\alpha$ , and combinations thereof were measured after 3 and 14 h. Data are represented as mean of three samples.

(F) Cells with the  $T_{Nrev}$  signature are present among the  $T_N$  from tonsils, but not from PB. The expression of CD95 and integrin  $\beta 7$  was measured gating CCR7 $^+$ /CD45RA $^+$  CD8 $^+$  T cells from tonsils of seven patients with recurrent acute tonsillitis or from PB of seven unrelated healthy individuals.

CD127 $^{low}$ CD25 $^{high}$  phenotype. However, expression of the receptors for IL-7 and IL-2 is down-regulated on T cells in the presence of their respective cytokines (Minami et al., 1993; Park et al., 2004; Vranjkovic et al., 2007). When  $T_{Nrev}$  were deprived of IL-7 and maintained in IL-2 for 2 weeks they adopted a phenotype almost indistinguishable from  $T_{SCM}$  and  $T_{MNP}$  with rapid decrease in CD25 expression and progressive increase in CD127 expression (Figure 3B). After an additional 2 weeks of culture with IL-2 there was further progressive loss of CD49d, CD95, CXCR3, and integrin  $\beta 7$  (Figure 3C) such that late  $T_{Nrev}$  acquire a phenotype approaching that of primary  $T_N$ , although their epigenetic signature clearly identifies them as a different population. We were unable to monitor the cells further due to increased cell death. These results suggest that the cytokine milieu and the time since activation account for the modest phenotypic diversity between  $T_{Nrev}$ ,  $T_{SCM}$ , and  $T_{MNP}$  (Figure 3D).  $T_{Nrev}$  also share functional characteristics with  $T_{MNP}$  as the latter cells express granzyme B and secrete IFN $\gamma$  and TNF- $\alpha$  after re-stimulation with phorbol myristate acetate (PMA) plus ionomycin (Pulko et al., 2016). Resting  $T_{Nrev}$  also became polyfunctional after the same treatment, r (Figure 3E).

To assess the *in vivo* relevance of phenotypic reversion we also looked for the presence of cells with the  $T_{Nrev}$  signature in the blood and secondary lymphoid tissue (tonsils) of adult donors. CD8 $^+$  T cells with a CCR7 $^+$ CD45RA $^+$  naive phenotype and expression of CD95 and integrin  $\beta 7$  were present within tonsil but were not seen in blood ( $p = 0.017$ , unpaired t test, Figure 3F). The population of memory T cells within tonsil had a CD95 $^{low}$  and integrin  $\beta 7^-$  phenotype (Figure S4) and was clearly distinguishable from the putative  $T_{Nrev}$ .

**Substantial Chromatin Reorganization Is Observed during Differentiation from  $T_N$  to  $T_{EM}$  and This Is Partially Retained following Reversion**

Epigenetic modifications have a profound regulatory influence on CD8 $^+$  T cell differentiation and function (Henning et al., 2018; Moskowitz et al., 2017). We next used ATAC-seq to investigate the profile of chromatin landscape remodeling during T cell differentiation and reversion. ATAC-seq analysis was performed on purified  $T_N$ ,  $T_{CM}$ ,  $T_{EM}$ , and  $T_{Nrev}$  CD8 $^+$  populations following *in vitro* culture. ATAC-seq read density profiles at phenotype-defining genes such as *CCR7* and *GZMB* were compatible with lineage-specific expression (Figure S5).

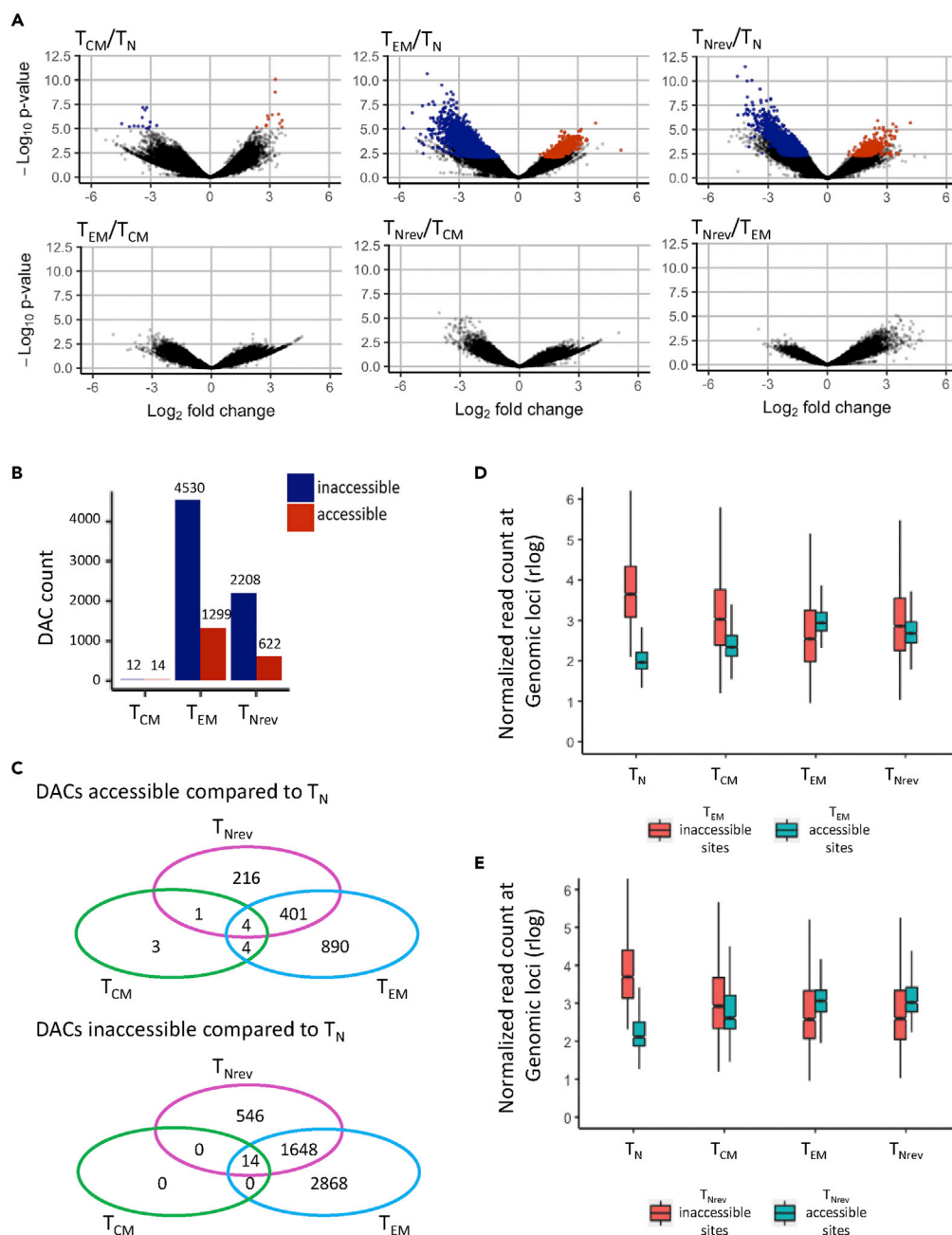
Differentially accessible chromatin sites (DACs) were identified within memory subsets and contrasted with the profile in naive cells (Figures 4A and S6A). The majority of epigenetic modifications were acquired relatively late in differentiation during transition from  $T_{CM}$  to  $T_{EM}$ . In particular, only 26 DACs developed during transition from naive to central memory cells but this increased markedly to 5,829 with further differentiation to  $T_{EM}$ . Interestingly, 51% of these DACs were lost during reversion to  $T_{Nrev}$  but 2,830 DACs still remained within  $T_{Nrev}$  cells (Figures 4A and 4B). Read density distributions at  $T_{EM}$  and  $T_{Nrev}$  DACs further indicate that the chromatin landscape of  $T_{Nrev}$  cells retains similarity to  $T_{EM}$  cells (Figures 4C and 4D) and is supported by principal component analysis of sample-wise chromatin accessibility, which identified unique groups for the  $T_N$ ,  $T_{CM}$ , and  $T_{EM}$  populations and alignment of  $T_{Nrev}$  with the memory subtypes (Figure S6B).

We next investigated the balance of open and closed chromatin during differentiation and reversion. A relative increase in the number of inaccessible chromatin regions was observed during differentiation with 4,316 closed and 1,299 open DACs in  $T_{EM}$  compared with  $T_N$  (Figure 4E). This profile was retained within the  $T_{Nrev}$  population with values of 2,194 and 617 DACs, respectively. The great majority of DACs within  $T_{Nrev}$  were shared with the  $T_{EM}$  population, although 216 and 546 regions were uniquely open and closed, respectively, within this subtype.

**Biochemical Pathways Associated with Reversion Can Be Identified by Epigenomic and Transcriptional Analysis of T Cell Subsets**

In order to examine the relationship between chromatin landscape and gene expression, DAC regions were next annotated with the gene whose transcriptional start site was nearest to the peak summit.





**Figure 4. Chromatin Landscape Changes during Differentiation from  $T_N$  to  $T_{CM}$  and  $T_{EM}$  and Reversion to  $T_{Nrev}$**

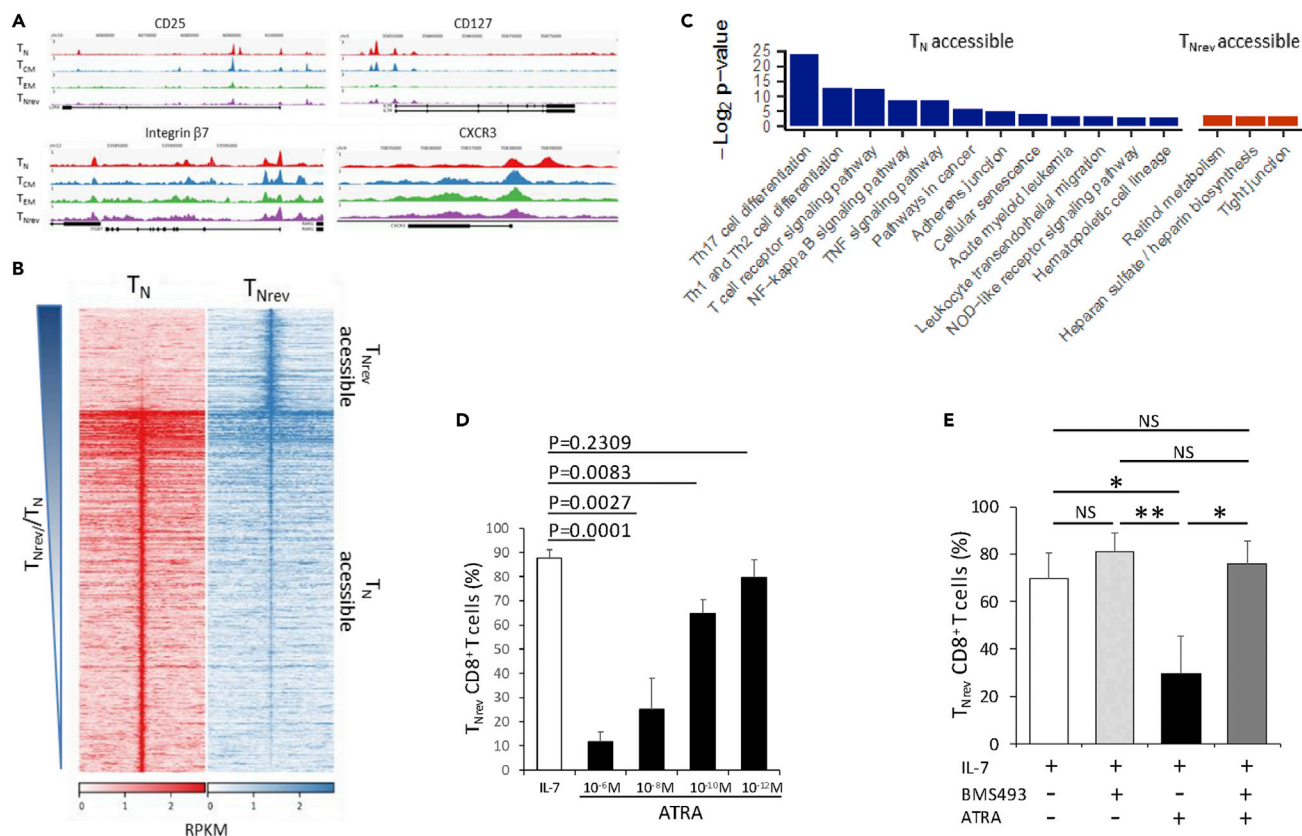
(A) Pairwise comparisons of chromatin accessibility at peak regions. The x axes indicate  $\text{Log}_2$  fold change, and the y axes indicate unadjusted  $-\text{Log}_{10}$  p value of all peaks. Colored points indicate differentially accessible chromatin sites with inaccessible sites as blue and accessible sites as red.

(B) DACs count for accessible and inaccessible regions in comparison with  $T_N$  are shown for  $T_{CM}$ ,  $T_{EM}$ , and  $T_{Nrev}$ .

(C) Tracking from  $T_N$  to  $T_{Nrev}$  the accessibility of DACs becoming inaccessible ( $T_N$  to  $T_{EM}$  closing)/accessible ( $T_N$  to  $T_{EM}$  opening) upon differentiation to  $T_{EM}$ .

(D) Tracking from  $T_N$  to  $T_{Nrev}$  the accessibility of DACs becoming inaccessible ( $T_N$  to  $T_{Nrev}$  closing)/accessible ( $T_N$  to  $T_{Nrev}$  opening) upon reversion to  $T_{Nrev}$ . The y axis is chromatin accessibility in units of rlog normalized mapped reads at the peak site.

(E) Overlaps of differentially accessible sites. Overlaps of DACs more accessible in  $T_{CM}/T_{EM}/T_{Nrev}$  compared with  $T_N$  (left) and DACs less accessible in  $T_{CM}/T_{EM}/T_{Nrev}$  compared with  $T_N$  (right).



**Figure 5. Chromatin Accessibility Identifies Biochemical Pathways Specific for  $T_N$  and  $T_{Nrev}$**

(A) ATAC-seq signal tracks at selected markers that discriminate early  $T_{Nrev}$  from  $T_N$  and recently differentiated  $T_{CM}$ . Gene diagrams (bottom) show alternative transcripts with black boxes indicating exons. Each subset signal is aggregated across the constituent samples,  $n = 4(T_N)$ ,  $3(T_{CM})$ ,  $3(T_{EM})$ ,  $4(T_{Nrev})$ . The y axes are in units of reads per million mapped reads.

(B) DAC sites in  $T_{Nrev}$  versus  $T_N$  cells. Normalized mapped read density (RPKM) of aggregated  $T_N$  ( $n = 4$ ) and  $T_{Nrev}$  ( $n = 4$ ) mapped ATAC-seq reads at differentially accessible chromatin sites (centered on peak summit, extended  $\pm 5$  kbp).

(C) Pathways significantly enriched (adjusted  $p$  value  $< 0.1$ ) in genes closest to  $T_N$  accessible or  $T_{Nrev}$  accessible DACs.

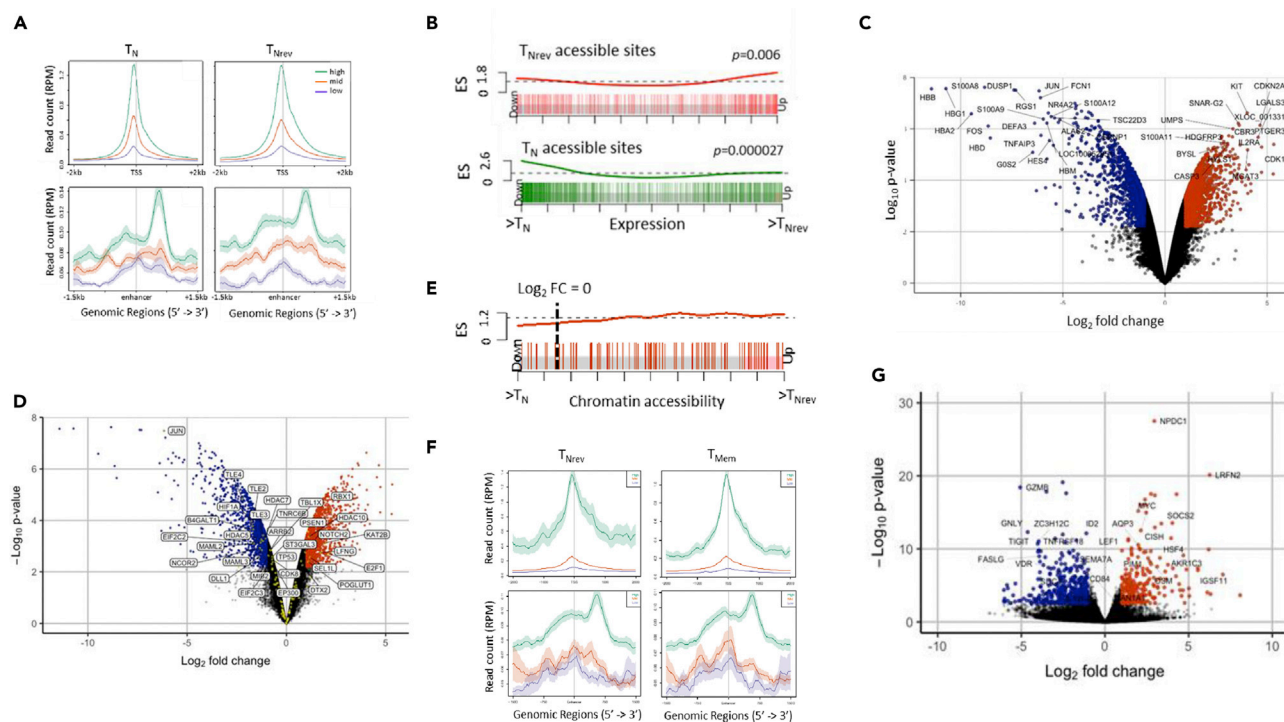
(D) Efficiency of reversion in the presence of ATRA. The percentage of CD8 $^+$   $T_{Nrev}$  was recorded at day 24 from activation in three CBMC samples. Unpaired t test.

(E) After activation CBMCs were incubated with the indicated combination of IL-7 25 (ng/mL), ATRA ( $10^{-8}M$ ), and BMS ( $493.3 \times 10^{-6}M$ ). Data are from three CBMC samples. One-way ANOVA.

As anticipated, differential chromatin accessibility was observed at genes encoding phenotypic markers that discriminate T cell subsets including CD25, CD127, integrin  $\beta$ 7, and CXCR3 (Figure 5A).

Genomic regions enrichment of annotations (GREAT) analysis (Table S2) revealed that the 1,648 DAC sites that became closed in  $T_{EM}$ , and were not reopened in  $T_{Nrev}$ , were enriched for pathways related to TCR signaling in naive T cells and CXCR4-mediated signaling. Sites that were opened during reversion of  $T_{EM}$  to  $T_{Nrev}$  showed enrichment for IL-7 signal transduction and Lck/Fyn-mediated initiation of TCR activation, whereas the 546 DAC sites uniquely closed in  $T_{Nrev}$  were enriched for pathways involved in generation of T cell cytotoxicity.

To further interrogate the differences between true  $T_N$  and  $T_{Nrev}$  cells we combined DAC analysis with transcriptional analysis of the two populations. In total 2,830 DAC regions had been identified between the two subtypes, 622 of which were more accessible in  $T_{Nrev}$  and 2,208 less accessible (Figure 5B). These regions were annotated with the gene whose transcriptional start site was nearest to the peak summit. Pathway enrichment analysis with g:Profiler highlighted that genes becoming less accessible in  $T_{Nrev}$  included those that regulate the major differentiation pathways for Th1, Th2, and Th17 cells (Figure 5C). Genes associated with retinol metabolism became markedly more accessible in  $T_{Nrev}$ , and is of note given the pleiotropic



**Figure 6. Chromatin Accessibility and Transcriptome Profiles of  $T_N$  and  $T_{Nrev}$**

(A) Average mapped read density profiles (centered on TSS (top) and enhancer regions (bottom)) generated from aggregated  $T_N$  (left) and  $T_{Nrev}$  (right) ATAC-seq reads. Profiles are for genes identified from transcriptome analysis to be expressed at low, medium, and high levels in  $T_N$  and  $T_{Nrev}$  cells, respectively. (B) Enrichment score (ES) for gene expression changing coordinately with chromatin accessibility. ES of genes closest to  $T_{Nrev}$  accessible (red) and  $T_N$  accessible (green) DACs, vertical bars indicate position of such genes on the axis of fold change in expression (ranking from most down-regulated in  $T_{Nrev}$  to most up regulated in  $T_{Nrev}$ ).

(C) Microarray analysis was performed on three  $CD8^+$   $T_N$  samples and on the respective  $CD8^+$   $T_{Nrev}$  cells. Pairwise comparison of gene expression in  $T_N$  versus  $T_{Nrev}$  cells showing  $-\text{Log}_2 p$  value versus  $\text{Log}_2$  fold change of all genes. Colored points indicate differentially expressed genes that are down-regulated in  $T_{Nrev}$  (blue) and up-regulated in  $T_{Nrev}$  (orange).

(D) The genes in the Notch pathway (yellow dots) that are significantly down-regulated and up-regulated in  $T_{Nrev}$  are labeled.

(E) Barcode plot from GSEA analysis showing ES of Notch signaling genes within sites ranked by chromatin accessibility. Vertical bars indicate position of such genes on the axis of fold change in chromatin accessibility, ranking from most inaccessible in  $T_{Nrev}$  to most up accessible in  $T_{Nrev}$ .

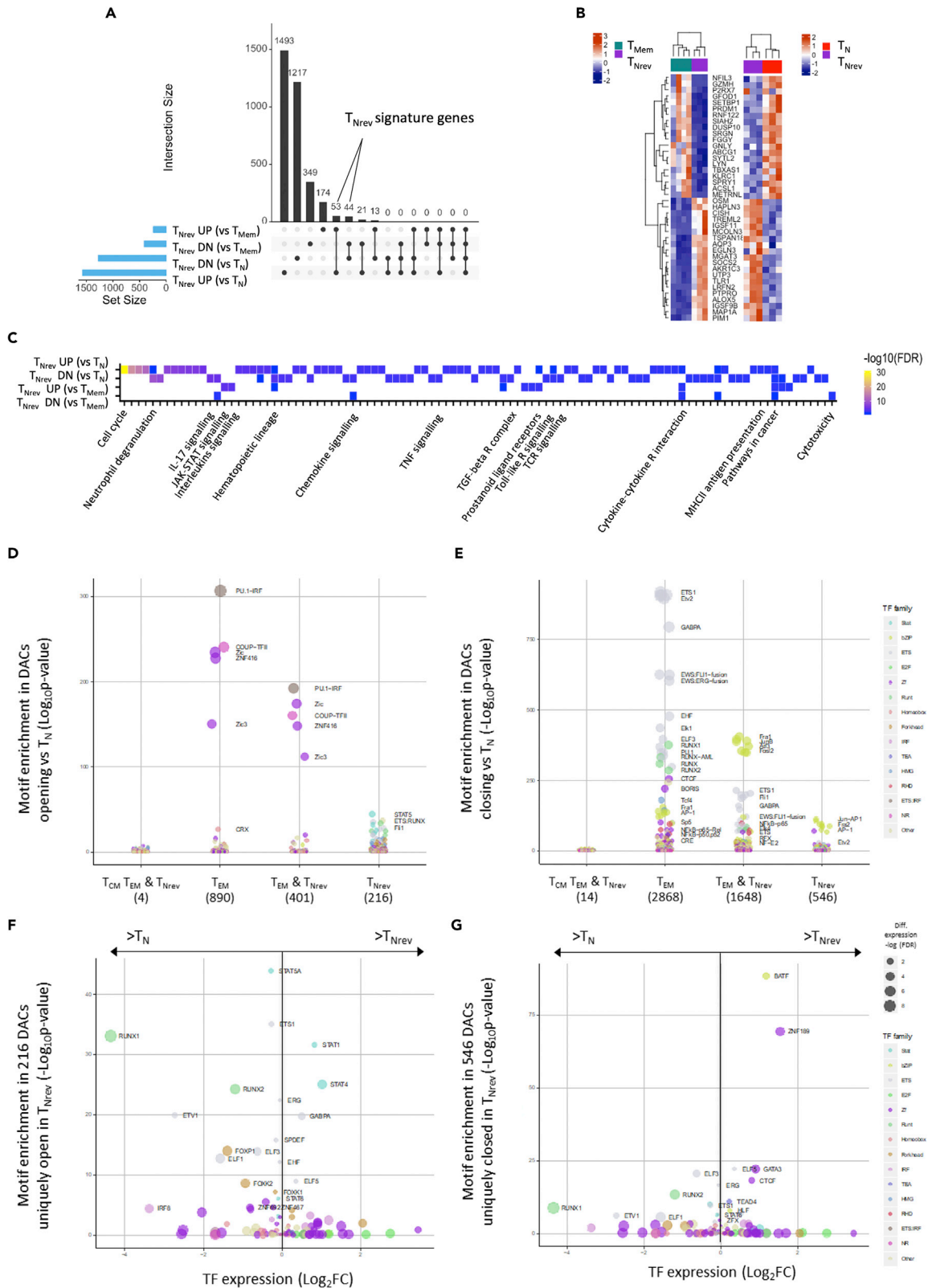
(F) As in (A) but for aggregated  $T_{Nrev}$  (left) and  $T_{Mem}$  (right) ATAC-seq reads.

(G) RNA-seq analysis was performed on four  $T_{Mem}$  samples (two  $T_{CM}$  and two  $T_{EM}$ ) and on the respective  $CD8^+$   $T_{Nrev}$  cells. Pairwise comparison of gene expression in  $T_N$  versus  $T_{Nrev}$  cells showing  $-\text{Log}_2 p$  value versus  $\text{Log}_2$  fold change of all genes. Colored points indicate differentially expressed genes that are down-regulated in  $T_{Nrev}$  (blue) and up-regulated in  $T_{Nrev}$  (orange).

effects on retinoic acid on T cell differentiation (Beijer et al., 2013). Indeed, escalating doses of all-trans retinoic acid (ATRA) progressively inhibited reversion of IL-7-treated  $CD8^+$  T cells (Figure 5D) and this was blocked by a pan-retinoic acid receptor antagonist (Figure 5E).

Transcriptional analysis confirmed that RNA expression levels were strongly associated with ATAC-seq read density at transcription start sites and enhancer regions (Figure 6A), and enrichment analysis of gene sets annotated at  $T_{Nrev}$  DACs confirmed strong relationship between chromatin accessibility and expression level (Figure 6B). Transcriptome analysis revealed 2,841 differentially expressed genes including major immune regulators such as *FOS*, *JUN*, *KIT*, and *IL2RA* (Figures 6C and 6F and Table S3). Moreover, 32 of the 104 genes within the Notch signaling pathway were differentially regulated in  $T_{Nrev}$  (Figures 6D and 6G). Gene set enrichment analysis (GSEA) of regions closest to Notch signaling genes confirmed an enrichment in accessible chromatin regions in  $T_{Nrev}$  cells (Figure 6E) particularly in the *HDAC2* and *HDAC9*-associated regions.

Comparative transcriptional analysis of  $T_{Nrev}$  with memory T cells ( $T_{Mem}$ ) (Figures S7A–S7C) also confirmed RNA expression to be associated with ATAC-seq read density (Figure 6F), and pairwise comparison



### Figure 7. Transcriptional Signatures of $T_{Nrev}$ Cells

- (A) Intersections of DEGs identified from differential expression analysis of  $T_{Nrev}$  versus  $T_{Mem}$  and  $T_{Nrev}$  versus  $T_N$ .  
 (B) Heatmap of the top 40  $T_{Nrev}$  signature genes. Z-scores were calculated for each gene from RNA-seq (left) and Microarray (right) datasets independently.  
 (C) Significant (FDR<0.1) pathway enrichments identified within DEG lists from  $T_{Nrev}$  versus  $T_{Mem}$  and  $T_{Nrev}$  versus  $T_N$ .  
 (D) TF-binding motif enrichments at DACs more accessible compared with  $T_N$ . Motif enrichments were calculated on the following DACs: 4 shared in  $T_{CM}$ ,  $T_{EM}$  and  $T_{Nrev}$ ; 890 in  $T_{EM}$ ; 401 shared in  $T_{EM}$  and  $T_{Nrev}$ ; 216 in  $T_{Nrev}$ .  
 (E) TF-binding motif enrichments at DACs less accessible compared with  $T_N$ . Motif enrichments were calculated on the following DACs: 14 shared in  $T_{CM}$ ,  $T_{EM}$ , and  $T_{Nrev}$ ; 2,868 in  $T_{EM}$ ; 1,648 shared in  $T_{EM}$  and  $T_{Nrev}$ ; 546 in  $T_{Nrev}$ .  
 (F) Expression of TFs with binding motifs enriched in loci that are uniquely open in  $T_{Nrev}$  cells. The x axis indicates fold change in TF expression, and the y axis indicates  $-\log_{10}$  p value of TF-binding motif enrichment in loci uniquely more accessible in  $T_{Nrev}$  cells. Increasing dot size indicates increasingly significant difference in TF expression and color indicates TF family.  
 (G) As in (D) but for TFs with binding motifs enriched in loci uniquely closed after reversion to  $T_{Nrev}$ .

revealed 447 genes down-regulated in  $T_{Nrev}$  including several involved in T cell cytolytic activity such as *GZMB*, *GZMH*, and *GNLY*. In contrast, 267 genes were up-regulated and included proteins that support cell survival and act to block cell differentiation, such as *CISH*, *NPDC1*, *HSF4*, and *OSM* (Figure 6G). Interrogation of the transcriptomes of  $T_{Nrev}$ ,  $T_{Mem}$ , and  $T_N$  subsets allowed identification of 97 signature genes specific for  $T_{Nrev}$  (Figures 7A and 7B) and pathways enriched in genes that were differentially regulated in this subset (Figure 7C). These include a number of intracellular signaling pathways, such as JAK-STAT and the RUNX-dependent regulation of WNT signaling. Comparison of TF transcripts in  $T_{Nrev}$  and  $T_{Mem}$  (Figure S8) showed differences in the expression of TFs related to stemness and generation of  $T_{SCM}$  (Gattinoni et al., 2012; Kondo et al., 2018).

### Reversion Is Associated with Opening of Binding Sites for RUNX and STAT Transcription Factors and Closure of Sites that Bind BATF

TFs can instigate chromatin remodeling and act as important regulators of differentiation. As such, we next assessed the relative enrichment of TF-binding motifs within genomic regions that became differentially open or closed in the different cell subsets. DACs that became more accessible in  $T_{EM}$  were enriched in binding motifs for five TF complexes, including PU.1/IRF, COUP-TFII, and zinc finger members, and these open sites were largely retained during reversion to  $T_{Nrev}$  cells (Figures 7D and 7E). In contrast, many TF-binding motifs became less accessible upon differentiation to  $T_{EM}$  although this profile was not strongly retained in the  $T_{Nrev}$  subset.

Finally, in order to gain insight into the potential regulators of reversion we focused on the relative access of TFs for regions of chromatin that were uniquely open or closed in  $T_{Nrev}$  cells. Strikingly, chromatin regions containing binding motifs for ET1, RUNX1, and RUNX2, as well as STAT1, STAT4, and STAT5, all became more accessible during reversion, although transcriptional activity from RUNX1 and RUNX2 genes was suppressed in the revertant population (Figure 7F and Table S4). In contrast, there was substantial closure of chromatin regions containing binding motifs for BATF and ZNF189 (Figure 7G and Table S4), which is of particular note given the importance of BATF in driving PD-1-mediated T cell exhaustion (Wherry, 2011).

## DISCUSSION

There is increasing appreciation of the importance of cellular plasticity (Blanpain and Fuch, 2014), and reversion of mature cells into stem cells has been confirmed in some organ systems (Stange et al., 2013; Tata et al., 2013). Here we show that extensive phenotypic reversion of effector  $CD8^+$  T cells to naive phenotype can occur within the human immune system. Reversion was mediated primarily by IL-7, which is expressed by a range of stromal cells within secondary lymphatic organs and is therefore available to support reversion following local antigen-driven activation (Huang and Luther, 2012). Indeed, cells with a  $T_{Nrev}$  phenotype were located within human tonsil. An interesting observation was that the addition of IL-7 markedly decreased apoptosis, suggesting that reversion may be a “default” pathway of recently activated  $T_N$  cells in the presence of appropriate survival signals (Hong et al., 2012; Mackall et al., 2011; Surh and Sprent, 2008).

The finding sheds light on the potential relationship between the  $T_{SCM}$ ,  $T_{MNP}$ , and  $T_{Nrev}$  populations. These three groups share a common core phenotype exemplified by expression of CD45RA, CCR7, and CXCR3. CD45RA regulates the signaling threshold in T lymphocytes (Hermiston et al., 2003; Irles et al., 2003), and CCR7 permits entry into secondary lymphoid tissue, whereas CXCR3 plays a fundamental role in extravasation of  $CD8^+$  T cells into inflammatory sites (Cole et al., 1998; Mikucki et al., 2015; Peperzak et al., 2013).

The naive-memory phenotype therefore generates an antigen-specific memory pool, which retains the ability to enter lymphoid tissue but has developed heightened responsiveness to re-challenge and may gain rapid access to tissue sites.

Interestingly, the major differences in the phenotype of  $T_{Nrev}$ ,  $T_{SCM}$ , and  $T_{MNP}$  relate to expression of the IL-7 and IL-2 receptors and these were modulated on  $T_{Nrev}$  according to the local concentration of IL-2 and IL-7 (Minami et al., 1993; Park et al., 2004; Vranjkovic et al., 2007).  $T_{SCM}$  also express CD95<sup>+</sup>, whereas  $T_{MNP}$  express CD49d, and we observed that both receptors are down-regulated during prolonged incubation, with CD95 expression falling more rapidly than CD49d expression. As such, we would suggest that the three populations represent a spectrum of naive-memory cells that are generated by reversion and display modest phenotypic diversity that varies according to cytokine concentration and time since activation. Indeed, phenotypic transition of  $T_{EM}$  to  $T_{CM}$  populations has been observed in murine systems (Wherry et al., 2003), and reversion from  $T_{EM}$  to  $T_{CM}$  and from these subsets to  $T_{SCM}$  was described in patients following hematopoietic stem cell transplant (Cieri et al., 2015).

This work builds on the work of Cieri et al. who previously demonstrated the generation of  $T_{SCM}$  from naive cells after T cell engagement in the presence of IL-7. However, in that study the cytokine was included in culture from the start of activation. We certainly do not rule out the possibility that  $T_{MNP}$  and  $T_{SCM}$  may also be generated by additional mechanisms such as direct differentiation from  $T_N$  (Cieri et al., 2013; Lugli et al., 2013; Sabatino et al., 2016; Zanon et al., 2017) and CD8<sup>+</sup>  $T_{SCM}$  have also been induced *in vitro* by activation of T cells in the presence of a glycogen synthase-3 $\beta$  inhibitor (Sabatino et al., 2016). Engagement of the Notch pathway in memory T cells also generates  $T_{SCM}$ -like CD8<sup>+</sup> and CD4<sup>+</sup> T cells (Kondo et al., 2017), and we found a number of genes in the Notch pathway to be differently expressed between  $T_N$  and  $T_{Nrev}$  (Figure 6D). Furthermore, IL-7 can further enhance with Notch signaling to induce a  $T_N$ -like phenotype in recently activated CD8<sup>+</sup> T cells (Kondo et al., 2018). These findings suggest that notch engagement and IL-7 may represent two alternative mechanisms to generate  $T_{SCM}$ -like cells.

Importantly, we observed that  $T_{Nrev}$  cells were able to undergo several rounds of reversion *in vitro*, and as such this process may be important in protection from both acute and chronic infectious agents. Indeed, it is now clear that a substantial proportion of antigen-experienced T cells is contained within the apparent “naive” CD8<sup>+</sup> T cell pool (Ellefsen et al., 2002; Remmerswaal et al., 2012). Longer-term culture of  $T_{Nrev}$  led to progressive down-regulation of integrin  $\beta 7$  and CXCR3, but it is uncertain if they can ultimately acquire a phenotype indistinguishable from that of primary  $T_N$ .

Most of our work was performed on T cells from CB, which contains very few memory or effector cells. We did observe phenotypic reversion using  $T_N$  cells from adult donors, although the relative proportion of cells that underwent reversion was sharply reduced and may reflect the decreased number of open chromatin sites and binding sites for TF in adult PB. Interestingly, the epigenetic landscape of CD8<sup>+</sup> T cells in older people is globally biased toward a differentiated phenotype (Moskowitz et al., 2017) with a reduction in chromatin accessibility that is most apparent at the IL-7R locus (Ucar et al., 2017).

Phenotypic reversion may help to explain the paradox of preservation of the human  $T_N$  pool during aging despite *in vivo* analyses and mathematical modeling suggesting that thymic output is insufficient for its maintenance (den Braber et al., 2012; Hakim et al., 2005; Murray et al., 2003). Interestingly, it was found that the  $T_{SCM}/T_N$  ratio in PB increases with age (Li et al., 2019), suggesting that during aging naive-memory cells replace  $T_N$  and sustain immunological memory.

Epigenetic regulation maintains the equilibrium between self-renewal and differentiation of stem cells and regulates tissue homeostasis throughout life. As such we were keen to understand how the chromatin landscape was modified following T cell activation and if these changes were reversible during phenotypic reversion to  $T_{Nrev}$ . Interestingly, this was largely not the case and  $T_{Nrev}$  cells retained an epigenetic profile that was similar to effector cells. As such,  $T_{Nrev}$  become “epigenetically primed” for secondary activation at the same time as they undergo phenotypic reversion to a naive-memory phenotype. The chromatin modifications within  $T_{Nrev}$  are likely to explain their ability to rapidly differentiate and acquire effector function in response to secondary stimulation and reveal a discrepancy between the degree of phenotypic and epigenetic reversion. This may partly explain the decrease in chromatin accessibility in phenotypically naive CD8<sup>+</sup> T cells in older people (Ucar et al., 2017). Furthermore, the observation that the chromatin landscape

of  $T_{Nrev}$  is much more extensively modified than that of  $T_{CM}$  provides further confirmation that they have undergone sequential differentiation and reversion rather than minimal differentiation from  $T_N$ .

Analysis of the distribution of TF-binding sites within differentially accessible chromatin regions can help to identify potential transcriptional regulators of differentiation. A striking observation was that many chromatin regions containing binding sites for BATF became closed during reversion. BATF is an essential regulator of  $CD8^+$  differentiation (Kurachi et al., 2014), and PD-1 engagement on T cells can drive BATF-dependent terminal differentiation (Quigley et al., 2010).

Reversion may play a potential role in limiting T cell exhaustion in both physiological and pathological settings, and it is noteworthy that the chromatin region containing the *IL-7R* gene becomes poorly accessible in exhausted  $CD8^+$  cells (Scott-Browne et al., 2016). In contrast, chromatin regions enriched for binding sites of several TFs, including RUNX, STAT, and ETS family members, became more accessible within revertant subsets. Stat1 and Stat4 signaling regulate T cell responses to interferon and cytokine signaling (Gil et al., 2006; Nguyen et al., 2002; Thierfelder et al., 1996), STAT5 is critical in maintaining effector  $CD8$  T cell responses (Tripathi et al., 2010), and over-representation of ETS motifs in chromatin accessible regions has been observed previously in naive T cells (Moskowitz et al., 2017). As such the “epigenetic priming” of naive-memory subsets appears to reflect an increased sensitivity to interferon and cytokines within the local microenvironment but protection from terminal differentiation.

Cytokine-driven reversion of recently activated  $CD8^+$  T cells thus uncovers a novel pathway for T cell differentiation and provides a unifying hypothesis for the existence of a naive-memory pool that contains  $T_{SCM}$ ,  $T_{MNP}$ , and  $T_{Nrev}$  populations. We also show that the chromatin structure of naive-revertant cells is substantially reorganized in comparison with the naive pool and as such they are epigenetically “primed for secondary activation. These observations will help to guide studies of fundamental mechanisms that regulate T cell differentiation and should also be of considerable value for optimal generation of naive-memory cells for adoptive T cell immunotherapy as less differentiated cells have been associated with superior engraftment, persistence, and antitumor activity (Hinrichs et al., 2011; Klebanoff et al., 2011).

### Limitations of the Study

A few limitations should be considered when interpreting our data. Although we identified cells with the phenotype of  $T_{Nrev}$  cells in human tonsil, it will be of interest to assess further if these are generated directly *in vivo*. In addition, it will be important to pursue parallel studies within animal models to interrogate potential mechanisms of phenotypic reversion.

### METHODS

All methods can be found in the accompanying [Transparent Methods supplemental file](#).

### DATA AND CODE AVAILABILITY

All relevant data are available from the authors upon request. RNA sequencing data have been deposited in Gene Expression Omnibus, accession number GSE114812.

### SUPPLEMENTAL INFORMATION

Supplemental Information can be found online at <https://doi.org/10.1016/j.isci.2020.100989>.

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## AUTHOR CONTRIBUTIONS

G.F. designed and performed experiments, interpreted the data, and wrote the paper; K.V. performed the ATAC-seq experiments and wrote the paper; W.C. analyzed microarray data and ATAC-seq data and wrote the paper; A.W. performed part of flow cytometry experiments; Z.N. analyzed microarray data; S.K. performed gene expression analysis; G.A. advised on experiments and edited the paper; P.M. and F.E.C. interpreted the data, supervised the study, and wrote the paper.

## DECLARATION OF INTERESTS

The authors declare no competing interests.

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**Supplemental Information**

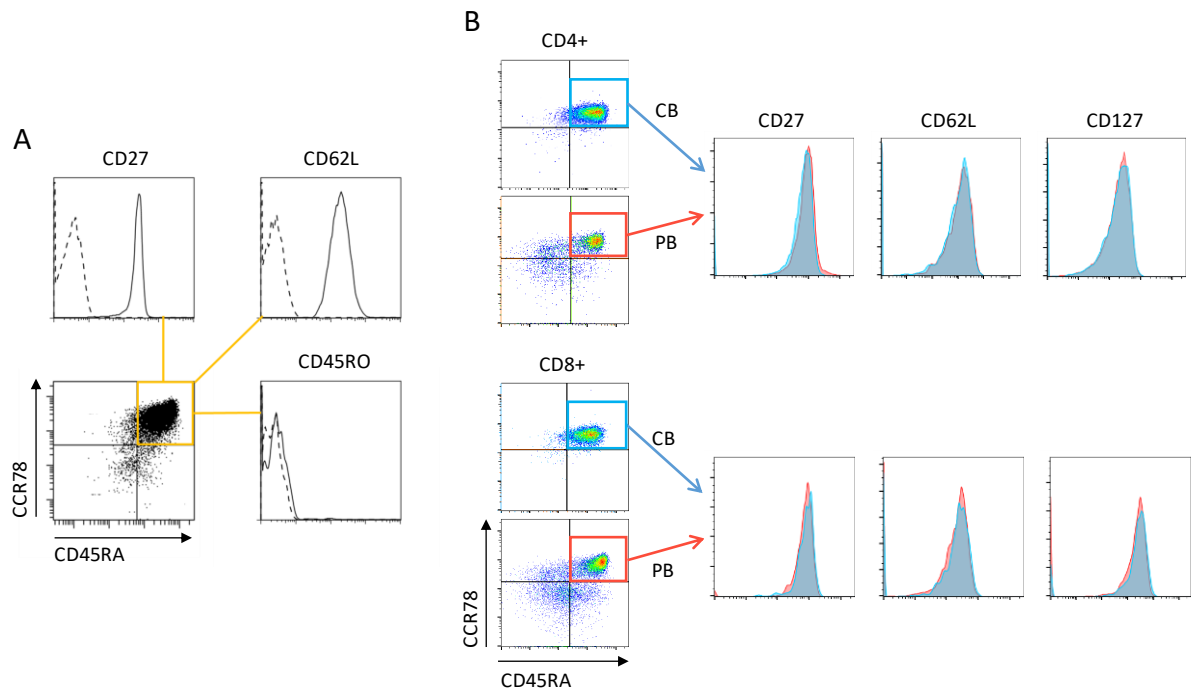
**Homeostatic Cytokines Drive Epigenetic**

**Reprogramming of Activated T Cells**

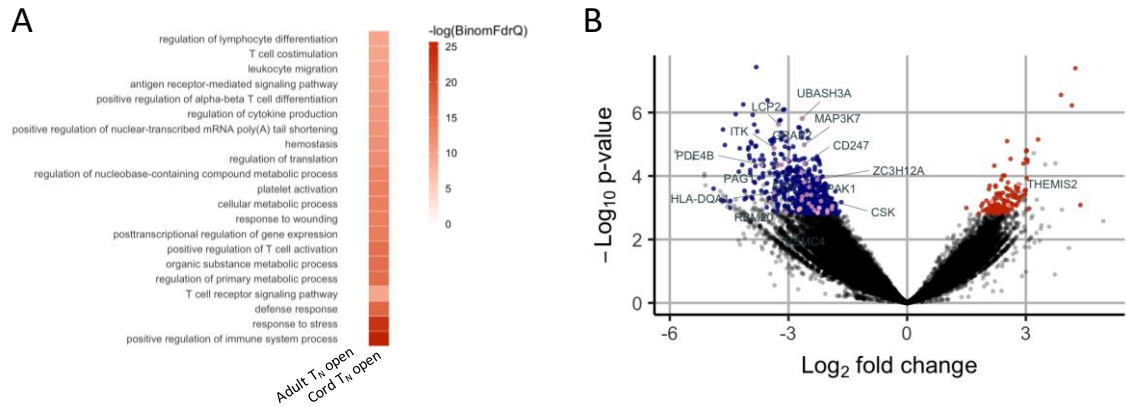
**into a “Naive-Memory” Phenotype**

**Guido Frumento, Kriti Verma, Wayne Croft, Andrea White, Jianmin Zuo, Zsuzsanna Nagy, Stephen Kissane, Graham Anderson, Paul Moss, and Frederick E. Chen**

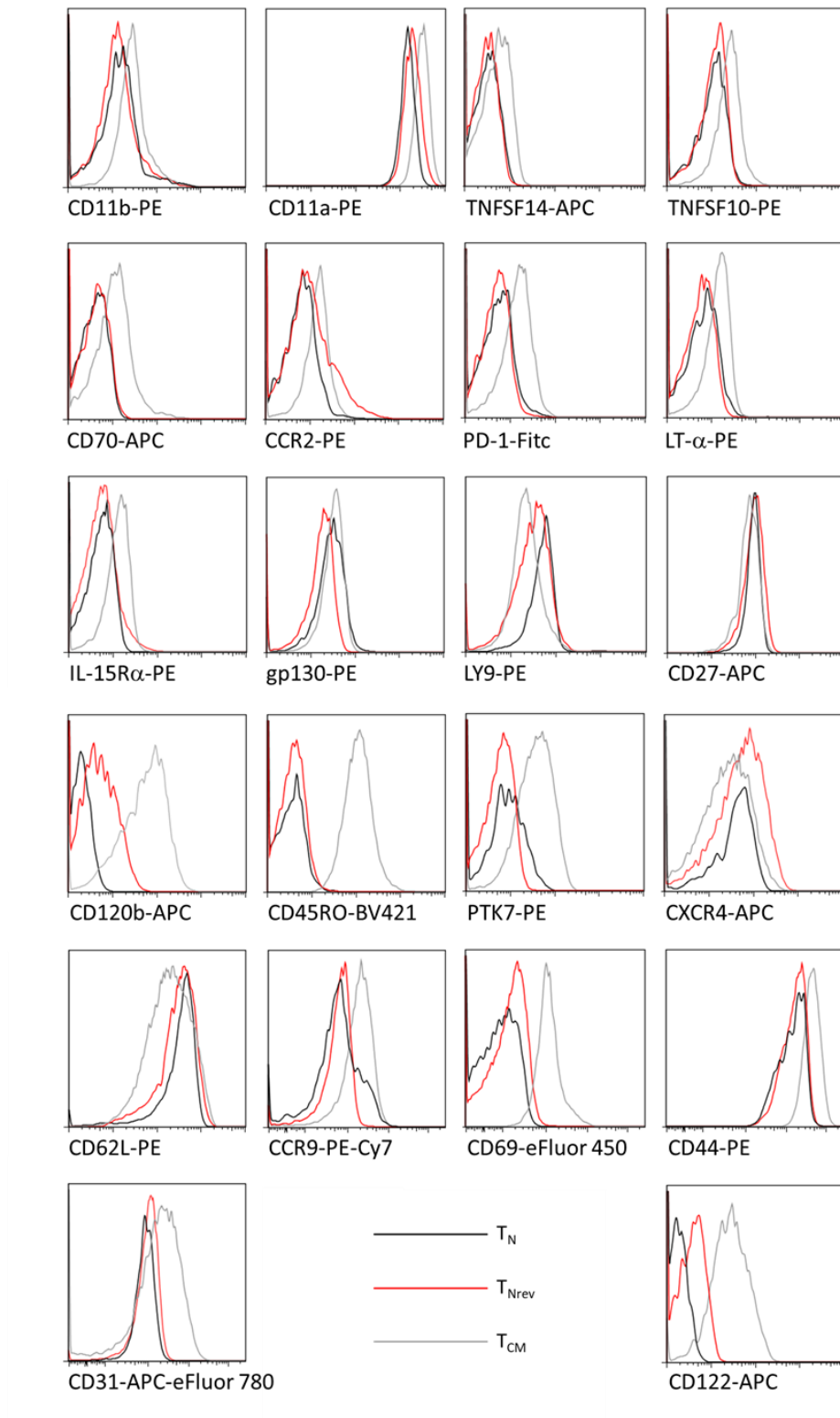
SUPPLEMENTAL INFORMATION



**Figure S1. The basal phenotype of  $T_N$  and  $T_{Nrev}$  from CB and PB, Related to Figures 1 and 2. (A)** The expression of CD27, CD45RO and CD62L in  $T_{Nrev}$ . The expression is shown for the cells having undergone phenotype reversion in Figure 1A, right panel. Dashed lines show the profiles of isotype controls. **(B)** The basal phenotype of  $T_N$  from CB and PB is shown.



**Figure S2. Pathways significantly enriched in chromatin sites preferentially open in  $T_N$  from PB or CB, Related to Figure 2.** (A) Selected significant ( $FDR < 0.1$ ) enrichments of GO terms (Biological Process) from DAC-associated gene annotations for DAC sites open in Cord  $T_N$  cells. No significant functional enrichments could be found at the sites preferentially open in samples from adults. Results are from 3 CB and 3 PB samples. (B) . Differential accessibility of peak regions identified in PB  $T_N$  cells vs CB  $T_N$  cells. The x-axis indicates  $\text{Log}_2$  fold change and the y-axis indicates  $-\text{Log}_{10}$  p-value of all peaks. Colored points indicate differentially accessible chromatin sites with inaccessible sites as blue and accessible sites as red. Points in pink are differentially accessible regions annotated as regulatory sites for genes in the biological process GO term T cell receptor signalling.



**Figure S3.** Extended screening for putative markers of  $T_{Nrev}$ , related to Figure 3. The membrane expression of non-discriminatory markers in  $T_N$ , recently reverted  $T_{Nrev}$  and recently differentiated  $T_{CM}$  is shown. Single representative experiment out of three.

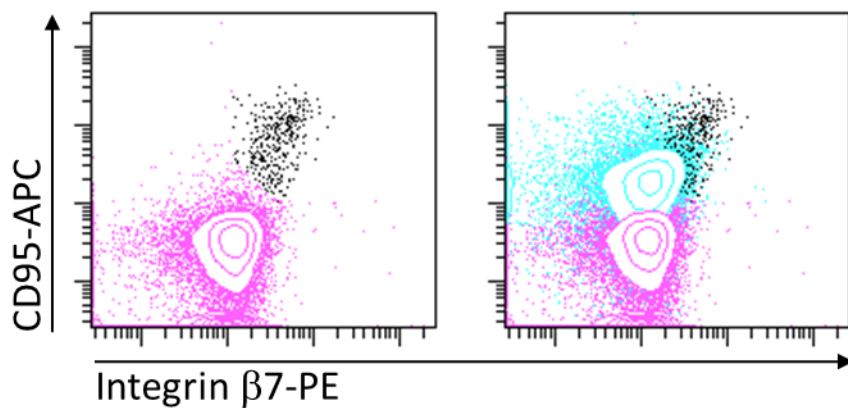


Figure S4. In tonsils, putative  $T_{Nrev}$  and memory  $CD8^+$  T cells differ in the expression of CD95 and integrin  $\beta 7$ , Related to Figure 3. In the left panel the expression of the two markers is shown for  $CCR7^+/CD45RA^+$   $CD8^+$  T cells; in the right panel the expression of CD95 and integrin  $\beta 7$  in memory  $CD8^+$  T cells, either  $CCR7^+/CD45RA^-$ ,  $CCR7-/CD45RA^-$  or  $CCR7-/CD45RA^+$ , is superimposed. In purple the classical  $T_N$ , in black the putative  $T_{Nrev}$ , and in pale blue the memory cells. Single representative experiment out of seven.

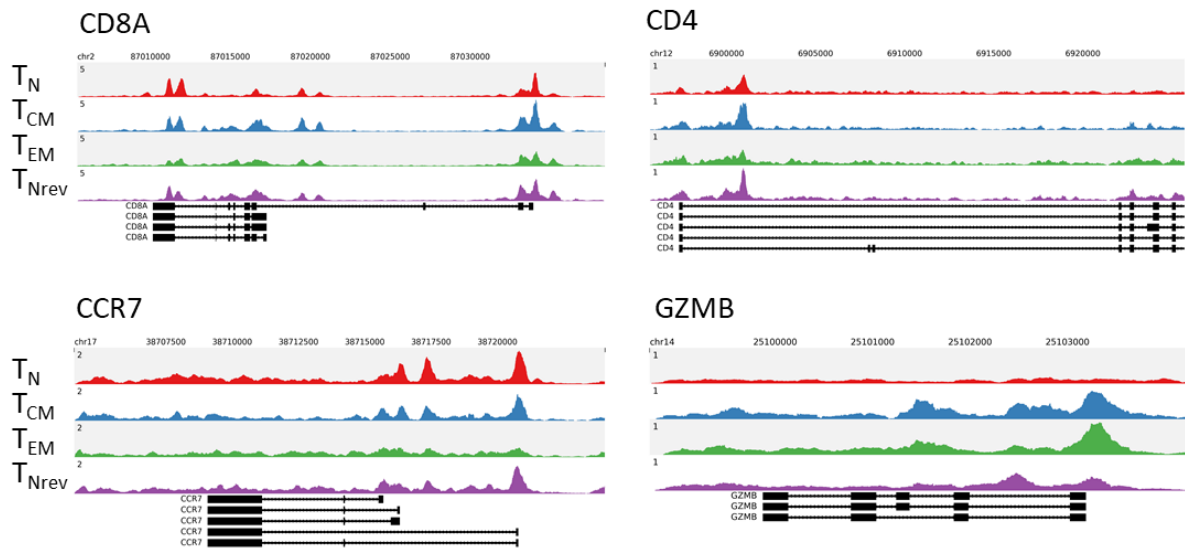
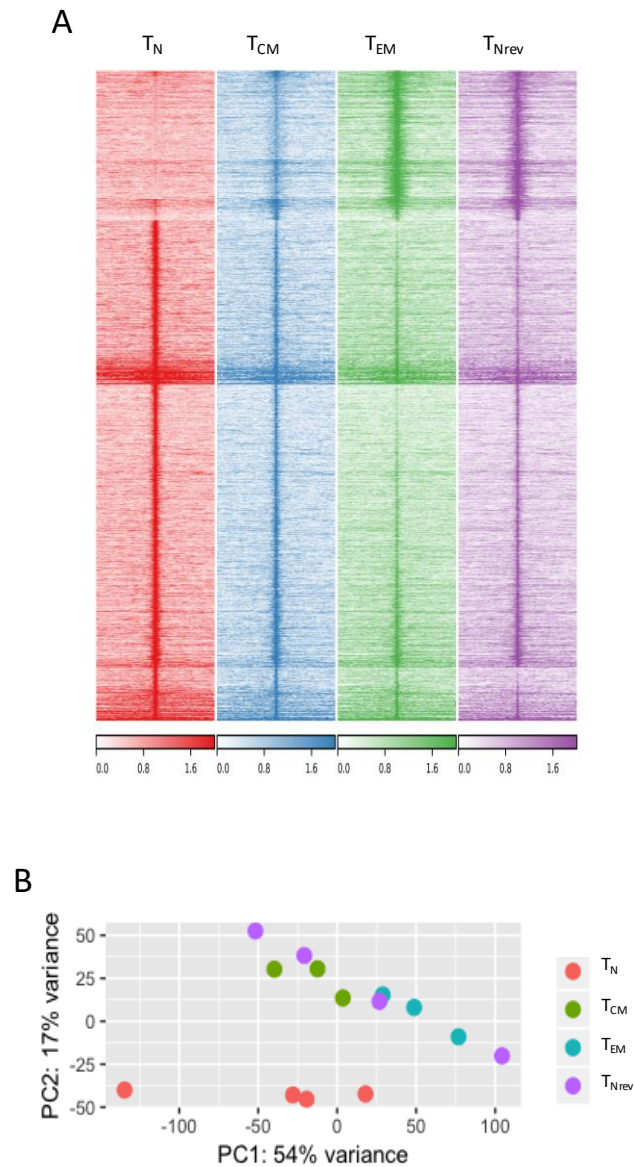
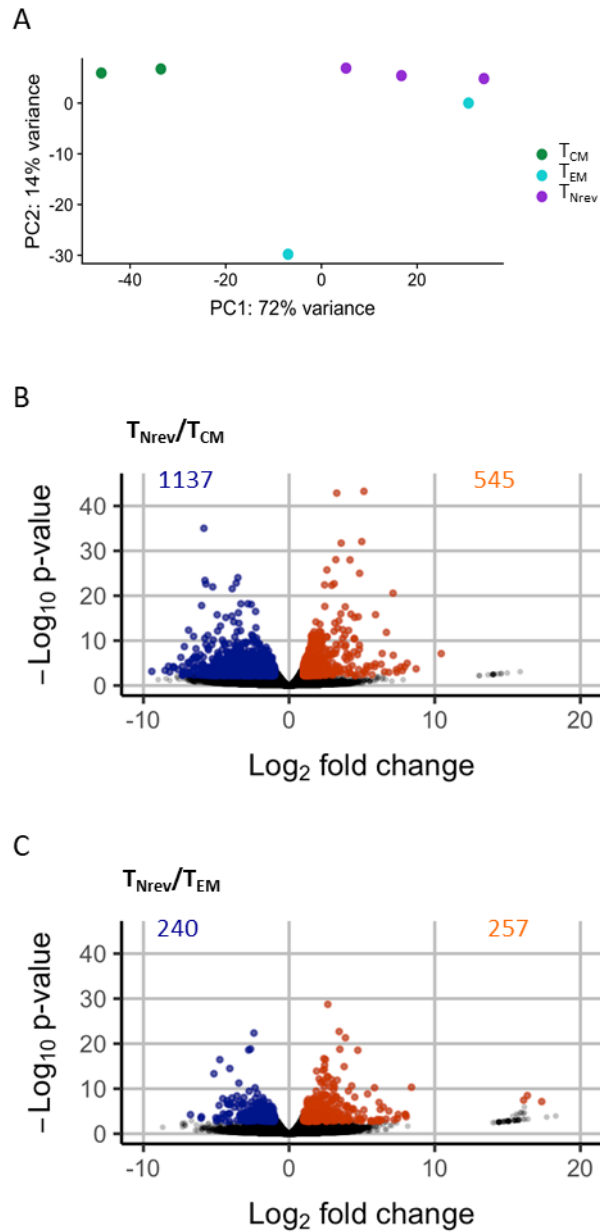


Figure S5. ATAC-seq signal tracks at selected genes confirming the purity of the samples, related to Figure 4. Gene diagrams (bottom) show alternative transcripts with black boxes indicating exons. Each subset signal is aggregated across the constituent samples,  $n = 4(T_N)$ ,  $3(T_{CM})$ ,  $3(T_{EM})$ ,  $4(T_{Nrev})$ . The y-axes are in units of reads per million mapped reads.



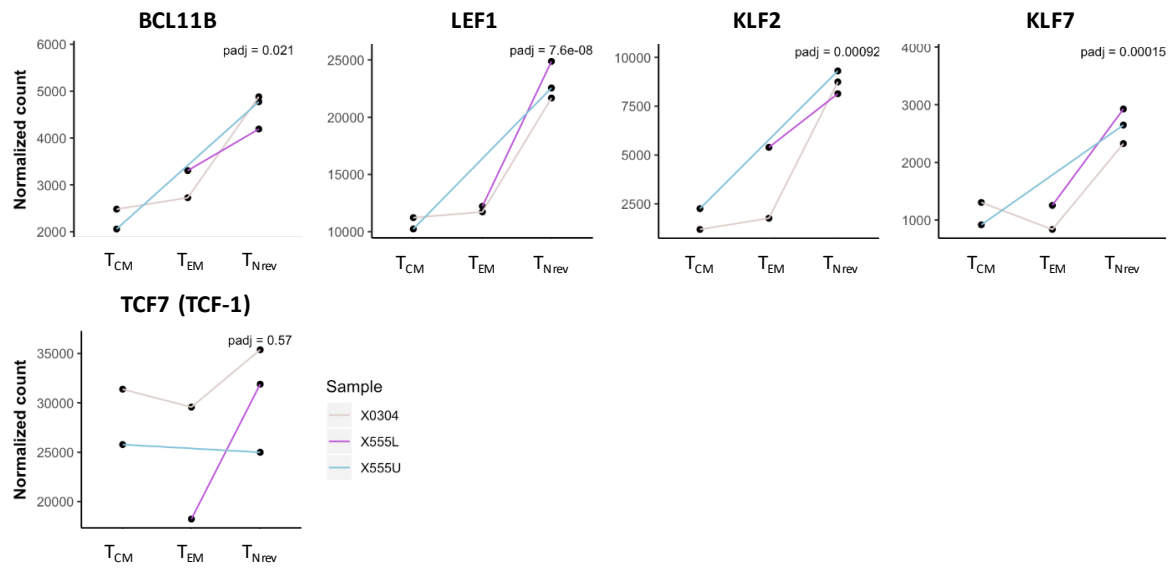
**Figure S6. Comparison of chromatin landscape in  $T_N$ ,  $T_{CM}$ ,  $T_{EM}$  and  $T_{Nrev}$ , Related to Figure 4.** (A) Peak sites that were differentially accessible in at least one pairwise comparison. Shown are normalized mapped read density (RPKM) of aggregated  $T_N$  ( $n=4$ ),  $T_{CM}$  ( $n=3$ ),  $T_{EM}$  ( $n=3$ ) and  $T_{Nrev}$  ( $n=4$ ) mapped ATAC-seq reads at differentially accessible chromatin sites (centred on peak summit, extended  $\pm 5$ kbp). (B) DACs counts for accessible and inaccessible sites are shown for  $T_{CM}$ ,  $T_{EM}$  and  $T_{Nrev}$  in comparison to  $T_N$ .



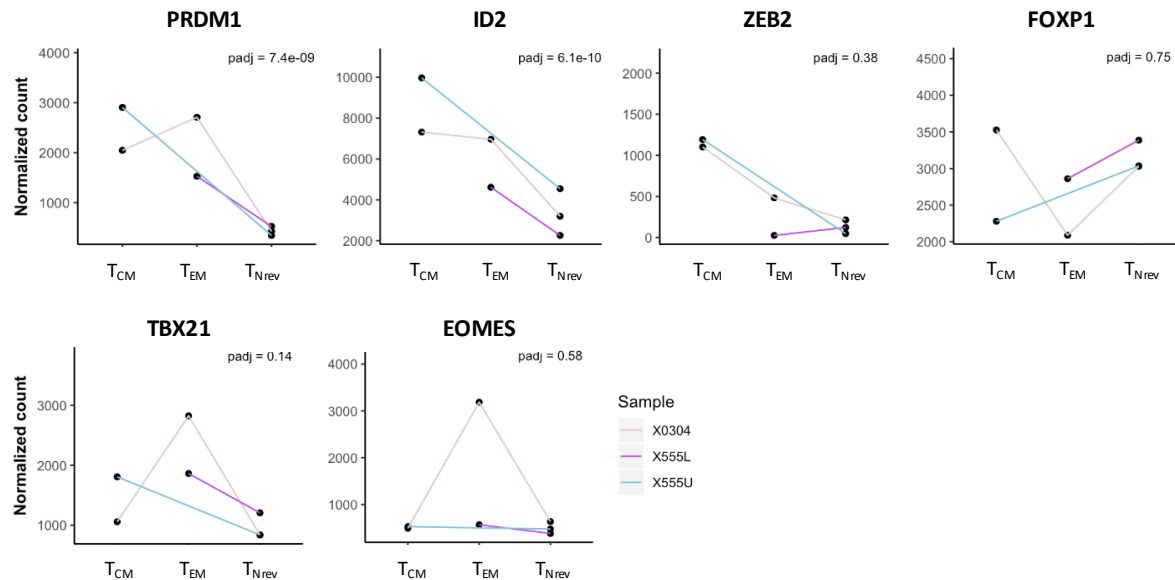


**Figure S7. Transcriptomes of  $T_{Nrev}$  compared  $T_{Mem}$  cells, Related to Figure 6.** Gene expression analysis was performed by RNAseq on 3  $CD8^+$   $T_{Nrev}$  samples, and 4  $CD8^+$   $T_{Mem}$  (2  $T_{CM}$  and 2  $T_{EM}$ ) samples. (A) PCA plot of all samples. Pairwise comparisons of gene expression in  $T_{Nrev}$  vs  $T_{CM}$  cells (B) and  $T_{Nrev}$  vs  $T_{EM}$  (C) show  $-\text{Log}_{10}$  p-value vs  $\text{Log}_2$  fold change of all genes. Colored points indicate differentially expressed genes that are down-regulated (blue) and up-regulated (orange) in  $T_{Nrev}$ .

A



B



**Figure S8. Stemness transcription factors of interest, Related to Figure 7.** Normalized expression from RNA-seq of T<sub>CM</sub>, T<sub>EM</sub> and T<sub>Nrev</sub> cells. Padj = p value adjusted for multiple testing from differential expression analysis of T<sub>Nrev</sub> vs T<sub>CM</sub> and T<sub>EM</sub> cells. Key Transcription factors with known increased (A) and decreased (B) expression.

Table S1. Cell numbers are not altered by phenotypic reversion, Related to Figure 1.

	CB 1		CB 2		CB 3	
	Day6	Day 16	Day8	Day 18	Day6	Day 20
CCR7 <sup>+</sup> /CD45RA <sup>+</sup>	32,1 <sup>A</sup>	872,1	9	345,5	21,3	1769,3
CCR7 <sup>+</sup> /CD45RA <sup>-</sup>	982,2	256,6	782,2	303,2	1560,9	487,9
CCR7 <sup>-</sup> /CD45RA <sup>-</sup>	308	79,2	183,7	101,4	213,2	33,1
CCR7 <sup>-</sup> /CD45RA <sup>+</sup>	5,4	72	1,4	32	2,9	43
Total	1327,7	1279,9	976,3	782,1	1798,3	2333,3

<sup>A</sup> Absolute number of CD8<sup>+</sup> T cells within different subsets at T<sub>N</sub> nadir (days 6 and 8) and T<sub>Nrev</sub> plateau (days 16, 18 and 20). Cell counts (x10<sup>3</sup>) from 3 different CB samples, enumerated using Trucount beads.

Table S2. GREAT analysis, Related to Figure 5.

<b>216 TNrev accessible sites</b>			
		NO ENRICHMENT	
<b>401 TNrev and TEM accessible sites</b>			
		NO ENRICHMENT	
<b>890 TEM accessible sites</b>			
		NO ENRICHMENT	
<b>546 TNrev inaccessible sites</b>			
	Binom Rank	Binom Raw P-Value	Binom FDR Q-Val
Signaling events mediated by focal adhesion kinase	2	2.16441E-06	0.001428513
Signaling events mediated by Hepatocyte GF Receptor (c-Met)	3	2.50412E-06	0.001101811
T Cytotoxic Cell Surface Molecules	5	1.64991E-05	0.004355768
Keratinocyte Differentiation	7	0.000126032	0.023766053
PDGFR-beta signaling pathway	10	0.000228715	0.03019034
HIF-1-alpha transcription factor network	15	0.000471389	0.041482267
<b>1648 TNrev and TEM inaccessible sites</b>			
	Binom Rank	Binom Raw P-Value	Binom FDR Q-Val
TCR signaling in naive CD4+ T cells	1	2.46E-27	3.24E-24
Genes involved in Immune System	2	3.81E-26	2.51E-23
TCR signaling in naive CD8+ T cells	3	1.18E-22	5.18E-20
T cell receptor signaling pathway	4	4.57E-21	1.51E-18
Thromboxane A2 receptor signaling	5	2.33E-18	6.14E-16
Genes involved in Generation of second messenger molecules	6	3.36E-17	7.40E-15
Keratinocyte Differentiation	7	5.08E-17	9.58E-15
CXCR4-mediated signaling events	8	7.31E-17	1.21E-14
Genes involved in TCR signaling	9	2.35E-15	3.44E-13
Genes involved in Adaptive Immune System	10	2.23E-14	2.94E-12
T Cell Signal Transduction	11	7.59E-14	9.10E-12
Genes involved in Platelet activation, signaling and aggregation	12	5.48E-13	6.03E-11
HIF-1-alpha transcription factor network	13	2.49E-11	2.53E-09
Signaling events mediated by VEGFR1 and VEGFR2	14	5.20E-11	4.90E-09
Genes involved in Cytokine Signaling in Immune system	15	1.64E-10	1.44E-08
Signaling events mediated by focal adhesion kinase	16	2.42E-10	2.00E-08
Genes involved in Lipoprotein metabolism	17	3.53E-10	2.74E-08
Role of Calcineurin-dependent NFAT signaling in lymphocytes	19	7.14E-10	4.96E-08
Genes involved in Lipid digestion, mobilization, and transport	21	7.27E-10	4.57E-08
Genes involved in Signaling by NOTCH	22	9.66E-10	5.80E-08
<b>2868 TEM inaccessible sites</b>			
	Binom Rank	Binom Raw P-Value	Binom FDR Q-Val
Genes involved in Adaptive Immune System	2	1.11E-23	7.36E-21
TCR signaling in naive CD4+ T cells	3	1.88E-23	8.28E-21
TCR signaling in naive CD8+ T cells	4	1.89E-21	6.24E-19
T cell receptor signaling pathway	5	9.77E-20	2.58E-17
CXCR4-mediated signaling events	6	8.47E-19	1.86E-16
Class I PI3K signaling events	7	1.36E-17	2.57E-15
Genes involved in TCR signaling	8	8.07E-16	1.33E-13
Natural killer cell mediated cytotoxicity	9	4.53E-15	6.64E-13
Genes involved in Cytokine Signaling in Immune system	10	8.55E-15	1.13E-12
T Cell Receptor Signaling Pathway	11	7.90E-14	9.48E-12
Genes involved in Signaling by the B Cell Receptor (BCR)	12	8.12E-14	8.94E-12
Genes involved in Phosphorylation of CD3 and TCR zeta chains	13	6.23E-13	6.33E-11
IL2-mediated signaling events	15	2.12E-12	1.86E-10
Signaling events mediated by focal adhesion kinase	16	3.08E-12	2.54E-10
Lck and Fyn tyrosine kinases in initiation of TCR Activation	17	6.43E-12	4.99E-10
PDGFR-beta signaling pathway	18	6.77E-12	4.97E-10
IL-7 Signal Transduction	19	3.86E-11	2.68E-09
Downstream signaling in naive CD8+ T cells	20	4.83E-11	3.19E-09
Thromboxane A2 receptor signaling	21	9.06E-11	5.69E-09
Fc-epsilon receptor I signaling in mast cells	22	1.15E-10	6.87E-09

Table S5. List of the antibodies used for flow cytometry, Related to Figure 1, Figure 2, Figure 3, Figure 5.

Antigen/ fluorochrome	Clone	Purchased from	Antigen/ fluorochrome	Clone	Purchased from
CCR2/PE	K036C2	BioLegend	CD45RA/Fitc	HI100	BD
CCR7/Fitc	G043H7	BD	CD45RA/PE-Cy7	HI100	BD
CCR7/PE	G043H7	R&D	CD45RO/BV421	UCHL1	BioLegend
CCR7/BV605	G043H7	BioLegend	CD49d/PE	9F10	eBioscience
CCR9/PE-Cy7	L053E8	BioLegend	CD62L/PE	DREG-56	BD
CD11a/PE	HI111	BD	CD69/eFluor 450	FN50	eBioscience
CD11b/PE	ICRF44	BD	CD70/APC	113-16	BioLegend
CD120b/APC	22235	R&D	CD8/Fitc	SK1	BD
CD122/APC	TU27	BioLegend	CD8/Pacific Blue	RPA-T8	BD
CD127/PE	A019D5	BioLegend	CD95/APC	DX2	BD
CD14/Pacific Blue	TuK4	Invitrogen	CXCR3/APC	1C6/CXCR3	BD
CD14/PerCP	134620	R&D	CXCR4/APC	12G5	eBioscience
CD16/Pacific Blue	3G8	Invitrogen	gp130/PE	28126	R&D
CD16/PerCP	245536	R&D	granzyme B/Fitc	GB11	BD
CD19/Pacific Blue	SJ25-C1	Invitrogen	IL-15Ra/PE	JM7A4	BioLegend
CD19/PerCP	4G7-2E3	R&D	Integrin $\beta$ 7/PE	473207	R&D
CD25/APC-Cy7	M-A251	BD	LT- $\alpha$ /PE	359-81-11	BioLegend
CD27/APC	57703	R&D	LY-9/PE	hLY-9.1.25	BioLegend
CD3/PE	OKT3	BioLegend	PD-1/Fitc	MIH4	BD
CD3/V500	UCHT1	BD	Perforin/Fitc	Dg9	eBioscience
CD31/APC-eFluor 780	WM-59	eBioscience	PTK7/PE	188B	Miltenyi
CD4/Fitc	SK3	eBioscience	TNFSF10/PE	RIK-2	BioLegend
CD44/PE	BJ18	BioLegend	TNFSF14/APC	115520	R&D

## TRANSPARENT METHODS

### Cell separation and culture.

The study was approved by the National Research Ethics Committee, UK REC no. 11/WM/0315, and by the Non-Clinical Issue committee of the NHS Blood and Transplant. Human CB from anonymized collections unsuitable for banking, was provided by the NHS Cord Blood Bank, UK, as Non-Clinical Issue. Peripheral blood (PB) was collected from consenting adult healthy blood donors from the NHS Blood and Transplant Donor Centre, Birmingham, UK.

PB mononuclear cells (PBMCs) and CBMCs were obtained by Ficoll separation. CD8<sup>+</sup> T<sub>N</sub> and T<sub>Nrev</sub> were enriched using the Naïve CD8<sup>+</sup> T cell Isolation Kit (Miltenyi Biotech, Bergisch Gladbach, Germany). CD8<sup>+</sup> T<sub>EM</sub> cells were negatively isolated after activation of enriched CD8<sup>+</sup> T<sub>N</sub> by removal of CCR7<sup>+</sup> and CD45RA<sup>+</sup> cells with anti-CCR7-APC, anti-CD45RA-APC and anti-APC MicroBeads (Miltenyi). CD8<sup>+</sup> T<sub>CM</sub> cells were isolated from less differentiated samples by depletion of CD45RA<sup>+</sup> cells with anti CD45RA-APC and anti-APC MicroBeads. Cells were cultured in RPMI 1640 plus 10% FCS. CD4<sup>+</sup> T<sub>N</sub> cells were isolated with the Naïve CD4<sup>+</sup> T cell Isolation Cell Isolation Kit II (Miltenyi).

CD8<sup>+</sup> T<sub>CM/EM</sub> cells were negatively isolated from CD8<sup>+</sup> T<sub>N</sub> cells isolated as indicated above by removal of CD45RA<sup>+</sup> cells with anti-CD45RA-APC and anti-APC MicroBeads (Miltenyi).

Dendritic cells (DCs) were generated from adherent mononuclear cells after incubating in plates for 2 hours. Adherent cells were cultured in the medium supplemented on days 0, 3 and 6 with 50 ng/ml GM-CSF and 500 U/ml IL-4. On day 6, DCs were matured by adding 2 ng/ml IL-1 $\beta$ , 1000 U/ml IL-6 and 10 ng/ml TNF $\alpha$  (all from R&D Systems, Minneapolis, USA) (1997). DCs were recovered after a further 48 hours.

Mononuclear cells from tonsils were kindly provided by P Murray and E Nagy. Tonsils were obtained after tonsillectomy for recurrent acute tonsillitis, minced and dissociated by mechanical means and mononuclear cells were collected by Ficoll separation.

### **TCR gene transduction.**

CBMCs were retrovirally transduced with a TCR, specific for the HLA A11-restricted SSCSSCPLSK (SSC) peptide of the LMP2 protein of Epstein Barr virus, as previously described (Frumento *et al*, 2013). Briefly, cells were transduced with retrovirus 48 hours after activation. The retrovirus used was the pMP71-PRE vector (provided by C. Baum, Hannover, Germany) with genes encoding TCR  $\alpha$  and  $\beta$  chains isolated from an EBV-specific CD8<sup>+</sup> T cell clone that targets the HLA A\*1101-restricted epitope SSC derived from the viral protein LMP2 (Zheng *et al.*, 2015). To generate the retrovirus, Phoenix amphotropic packaging cells were transfected with the pMP71-PRE vector using FuGENE HD (Roche, Basel, Switzerland). After 48 hours the retroviral supernatant was recovered. Preactivated cells were seeded at 4–6  $\times$  10<sup>6</sup> cells/well in 1 ml RPMI onto 6-well plates coated with retronectin (Takara, Shiga, Japan). Retroviral supernatant (1.5 ml/well) or medium alone (mock-transduced) was added to each well and centrifuged for 1 h  $\times$  800 g at 30°C. Also described are generation of DCs, their loading with the peptide, and re-stimulation of transduced T cells with peptide-pulsed DCs.

### **Cell activation and treatment.**

Cells were activated, or re-activated, with either of the following stimuli.

Anti-CD3: cells were incubated with 66 ng/ml anti-CD3 antibody (OKT3), plus 300 U/ml IL-2 (Miltenyi).  
Anti-CD3 and crosslinked anti-CD28: cells were incubated with 66 ng/ml OKT3 plus a mix of 66 ng/ml LEAF anti-CD28 (BioLegend, San Diego, CA, USA) and 66 ng/ml rat anti-mouse IgG1 (BioLegend), and 50 U/ml IL-2.  
CD3/CD28 beads: Dynabeads T Activator CD3/CD28 (Life Technologies, Grand Island, NY) beads were incubated with CBMCs at 1:1 ratio in the presence of 30 U/ml IL-2.  
PHA: cells were incubated with 1% PHA M (Life Technologies, Carlsbad, CA, USA), plus 50 U/ml IL-2.  
SEB: cells were incubated with 1  $\mu$ g/ml SEB (Sigma-Aldrich, St. Louis, MO, USA), plus 50 U/ml IL-2. From day 2, IL-2 100 U/ml, for stimulation with soluble anti-CD3, or 30 U/ml, for the other cases, was added thrice a week. Phenotype was checked thrice a week. When the percentage of CCR7<sup>+</sup>/CD45RA<sup>+</sup> CD8<sup>+</sup> T cells dropped below 20%, half of the medium was replaced with fresh medium containing either IL-2, IL-4, IL-6, IL-7, IL-15 or IL-21 (all from Miltenyi), or combinations thereof, at final concentrations of 30 U/ml, 25 ng/ml,

10 ng/ml, 25 ng/ml, 50 ng/ml, and 50 ng/ml, respectively. Thrice a week, half of the culture medium was replaced with new medium plus cytokine(s). Re-activation by phorbol myristate acetate (PMA) plus ionomycin (Cell Stimulation Cocktail, eBioscience, San Diego, CA, USA) was performed exactly following manufacturer's instructions. BMS 493 (Tocris, Bristol, UK) was preincubated 3 hours before addition of IL\_7 and/or all-trans-retinoic acid (ATRA, Sigma Aldrich).

#### **Flow cytometry.**

The antibodies used for cell membrane staining are listed in Table S5. Gating strategy involved selection of single cells and use of a "dump channel" including either 7-aminoactinomycin D (BD, San Jose, CA, USA) and PerCP-conjugated anti CD14, CD16 and CD19, or Live/Dead Fixable Violet (Thermo Fisher Scientific, Wilmington, DE, USA) and Pacific Blue-conjugated anti CD14, CD16 and CD19. Proliferation was evaluated by staining cells with 1  $\mu$ M CFSE. For intracellular staining, cells were fixed and permeabilized using the FIX&PERM kit (ADG, Kaumberg, Austria) or Fixation/Permeabilization Solution Kit (BD) for staining of cytokines or TFs, respectively. Indirect staining was carried out for E2F-1 (clone 8G9, Novus Biologicals, Littleton, CO, USA) and KAT2B (clone EPR2670, Abcam, Cambridge, MA, USA). In this case a PE- conjugated rat anti-mouse IgG1 (clone RMG1-1, BioLegend, San Diego, CA, USA) and an APC-conjugated goat ant-rabbit IgG (R&D, Minneapolis, MN, USA) were used, respectively. In some experiments cells were enumerated using Trucount Beads (BD). Transduced lymphocytes were identified using HLA A\*1101:SSC peptide-specific pentamers and Tag/PE (Proimmune, Oxford, UK). Flow cytometry was performed on either a FACSCanto II, an LSR II, or a Fortessa (BD) flow cytometer. Quantifications were made on the basis of FACSDiva and FlowJo (both from BD) softwares.

#### **Cytotoxicity assay.**

Cytotoxicity of transduced T cells was assessed in a standard <sup>51</sup>Cr assay. Briefly, HLA A\*1101-transduced T2 cells were loaded with the concentrations of SSC peptide indicated in the text, then used as targets at 2500 cells/well in a 5 hrs test.



### ATAC-seq library preparation and analysis

For sequencing the open chromatin regions in the CD8<sup>+</sup> T cell subsets, we used a previously published method with slight modification (Brignall *et al*, 2017). In brief, 50,000 cells were sorted on a cell sorter (FACSARIA, BD) and pelleted by centrifugation at 500 × *g* and 4°C for 10 min. The cell pellet was washed once with cold PBS and centrifuged again. Pellets were resuspended in a 50-μl reaction cocktail containing 1 μl of 0.5% Digitonin (Promega, Madison, WI, USA), 2.5 μl of Tn5 transposase and 25 μl of TD buffer (Nextera DNA library preparation kit, Illumina, San Diego, CA, USA) and incubated for 30 min at 37°C with gentle shaking. The tagmented DNA was then purified using Minielute PCR Purification kit (Qiagen, Hilden, Germany) and eluted into 11 μl of elution buffer. The transposed DNA was then amplified using 2.5 μl of indexing primers and 25 μl of Nextera PCR master mix according to the PCR protocol previously described (Buenrostro *et al*, 2013). PCR clean-up was then performed using AMPure XP beads (Beckman Coulter, Brea, CA, USA), and resuspended in 30 μl of resuspension buffer. The libraries were quantified using Qubit fluorometer (Life Technologies), and the size was determined using TapeStation (Agilent, Santa Clara, CA, USA). Sequencing was performed on a High Throughput Benchtop NextSeq 500/550 Sequencer using NextSeq<sup>®</sup> 500/550 High Output Kit v2 - 75 cycles (Illumina, San Diego, CA, USA).

ATAC-seq data was aligned to the human genome (hg19) using Bowtie2 v2.2.9 with the settings: `--very-sensitive-local` (Langmead and Salzberg, 2012). Peaks were called on the alignments using MACS2 v2.2 with settings: `--keep-dup=auto --nomodel --shift -100 --extsize 200` (Zang *et al*, 2008). Peaks were annotated with closest gene (by RefSeq transcription start site) and average tag counts (400bp region centred on peak summit) using `annotatePeaks` from HOMER v4.8. Motif enrichment at peak regions was assessed using the HOMER program `findMotifsGenome` (Heinz *et al*, 2010). DACs were identified by pairwise comparisons in the R package DESeq2 (Love *et al*, 2014). Genome-wide average profile data at TSS and enhancer sites was obtained using `ngs.plot` v2.63 (Shen *et al*, 2014). Heatmaps of DACs and mapped read profiles at selected genomic regions were obtained using `fluff` v2.1.4 (Georgiou *et al*,

2016). ATAC-seq data have been deposited in Gene Expression Omnibus, accession number GSE120618, public release December 2018.

### **Microarray analysis.**

Gene expression analysis was performed on 3 CD8<sup>+</sup> T<sub>Nrev</sub> at day 19 and 3 CD8<sup>+</sup> T<sub>N</sub> samples. RNA extraction was performed using RNeasy columns (Qiagen). Source RNA was confirmed as high quality by use of a Bioanalyzer 2100 (Agilent). RNA Integrity Numbers of 6.0 were confirmed for all samples using a RNA 6000 Pico Chip kit (Agilent). 25ng of each source sample RNA was labeled with Cy3 dye using the Low Input Quick Amp Labelling Kit (Agilent). A specific activity of greater than 6.0 was confirmed by measurement with a spectrophotometer. 600 ng of labeled RNA was hybridized to SurePrint G3 Human 8x60K microarray slides (Agilent). After hybridization, slides were scanned with a High Resolution C Scanner (Agilent), using a scan resolution of 3 mm. Feature extraction was performed using Feature Extraction Software (Agilent), with no background subtraction. Extracted data were normalized using the R 3.4 software environment with the limma 3.32.5 analysis package (Smyth, 2004). Log transformed expression values were analyzed in limma using a moderated paired t-test. Microarray data that support the findings of this study have been deposited in Gene Expression Omnibus, accession number GSE114812, public release December 2018.

### **RNA-seq analysis**

RNA extraction was performed using RNeasy columns (Qiagen). TruSeq mRNA library preparation and sequencing was carried out by Edinburgh Genomics, The University of Edinburgh. Sequencing data were generated using NovaSeq 50PE.

### **Statistics**

Quantifications of events from flow cytometry were made using FACSDiva and FlowJo (both from BD) softwares.

Genes were classified as differentially expressed if Benjamini-Hochberg adjusted p-value <0.05 and absolute fold change >2. Peaks discovered from the ATAC-seq analysis were classified as differentially

accessible in a given pairwise comparison if **Benjamini-Hochberg adjusted p-value <0.1 and absolute log<sub>2</sub> fold change >1**. Pathway enrichment analysis was performed using G:profiler (Reimand *et al*, 2016) with a threshold adjusted p-value of <0.05 for reporting significant enrichments. Gene-set enrichment analysis (GSEA) was performed using the Bioconductor R package GAGE (Luo *et al*, 2009). The Hallmark and Canonical Pathways gene sets were downloaded from Molecular Signatures Database (MSigDB) (Liberzon *et al*, 2015). GSEA was also used to assess enrichment of published gene signatures for T<sub>SCM</sub> up/down-regulated vs T<sub>N</sub> (Gattinoni *et al*, 2011) and T<sub>MNP</sub> up/down-regulated vs T<sub>N</sub> (Pulko *et al*, 2016). T<sub>MNP</sub> up/down-regulated genes vs T<sub>N</sub> were extracted from published RNAseq count data downloaded from NCBI's Gene Expression Omnibus (GSE80306). Differentially expressed genes (DEGs) with Benjamini-Hochberg adjusted p-value<0.05 and absolute fold change >2 were identified using the R package DEseq2. Genomic Regions Enrichment of Annotations Tools (GREAT) (McLean *et al*, 2010) was used to identify functional enrichments within genes annotated as closest to differentially accessible chromatin sites. Functional and network analysis was performed on the pool of significant genes using Ingenuity Pathway Analysis (Qiagen).

In all the other cases statistical analysis was carried out using Graph Pad Prism software or Excel 2016. Results in graphs are reported as mean ± 1SD.

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