

REVIEW

Epigenetics of T cell aging

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Abstract

T cells are a heterogeneous population of cells that differ in their differentiation stages. Functional states are reflected in the epigenome that confers stability in cellular identity and is therefore important for naïve as well as memory T cell function. In many cellular systems, changes in chromatin structure due to alterations in histone expression, histone modifications and DNA methylation are characteristic of the aging process and cause or at least contribute to cellular dysfunction in senescence. Here, we review the epigenetic changes in T cells that occur with age and discuss them in the context of canonical epigenetic marks in aging model systems as well as recent findings of chromatin accessibility changes in T cell differentiation. Remarkably, transcription factor networks driving T cell differentiation account for many of the age-associated modifications in chromatin structures suggesting that loss of quiescence and activation of differentiation pathways are major components of T cell aging.

KEYWORDS

chromatin accessibility, DNA methylation, histone modification, immunosenescence, T cell differentiation, transcription factor

1 | INTRODUCTION

A distinguishing feature of the T cell system is its enormous plasticity at the single cell level.¹ As naïve T cells, they essentially function as their own stem cells repopulating the system. Homeostatic proliferation of naïve T cells is of particular importance in the human adult and maintains compartment size, when the thymus becomes too involuted to make a relevant contribution to T cell generation.^{2,3} Upon antigen recognition and under the influence of environmental cues, T cells differentiate into multiple lineages of effector and memory T cells. These different functional states of T cells are reflected in the organization of the chromatin that is modified by transcription factor networks downstream of signaling cascades.⁴ Ultimately, the epigenome regulates gene transcription by controlling accessibility of transcription factors to enhancer and promoter regions and facilitating their interaction in the three-dimensional space.^{5,6} For naïve T cells, the epigenetic state keeps the cells alive and quiescent while maintaining their

ability to proliferate and differentiate when stimulated. Conversely, the chromatin structure provides stability to memory states after the antigen has been eliminated.⁷ The epigenetic landscape of chromatin accessibility sites developed in effector T cells is maintained in memory cells for many years and is therefore an important mechanism for immune memory.⁸

Any disarray in the epigenetic structure can result in cellular dysfunction. It is therefore reasonable to implicate epigenetic modifications in the pathologies associated with aging, if not even taking the bolder view to see the functionality of the epigenome as a major driver of the aging process, including immune aging.^{9–11} Here, we review how studies of the epigenetic landscape in human T cells are beginning to be informative to understand the mechanisms that drive T cell aging.^{12,13} In particular, we will discuss 2 not necessarily mutually exclusive explanations for age-associated epigenetic signatures; their resemblance to epigenetic pathways that drive aging in model organisms; and their relationship to epigenetic modifications that are seen with normal T cell differentiation.

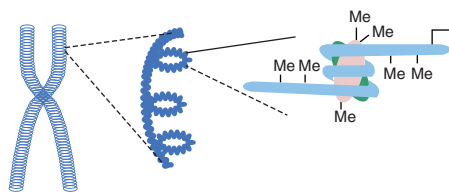
1.1 | The organization of the chromatin

The DNA in eukaryotic cells is packed into chromatin with nucleosomes being the basic unit (Fig. 1). Nucleosomes are composed of an

Abbreviations: ATAC-seq, assay for transposase accessible chromatin with high-throughput sequencing; bZIP, basic leucine zipper domain; DNMT, DNA methyltransferase; ENCODE, Encyclopedia of DNA Elements; EOMES, eomesodermin; FOXO, forkhead box O; MRC, mitochondrial respiratory chain; NRF1, nuclear respiratory factor 1; TEMRA, T effector cell expressing CD45RA; TET, ten-eleven translocation

Transcriptional Repression

Histone Methylation
(e.g. H3K9me2/3, H3K20me3, H3K27me2/3)
DNA methylation
(5mC)

**Transcriptional Activation**

Histone Methylation
(e.g. H3K4me1/2/3, H3K36me3, H3K79me3)
Histone Acetylation
(e.g. H3K9ac, H3K27ac)

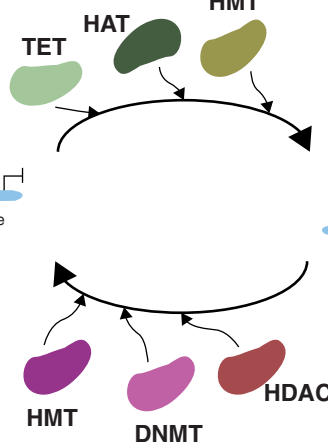
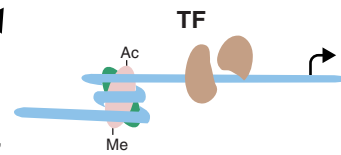


FIGURE 1 Epigenetic control of gene expression. DNA methylation and posttranslational histone modifications alter the chromatin structure, thereby facilitating activation or repression of gene transcription

octamer of 4 core histones (H3, H4, H2A, and H2B).¹⁴ The amino-terminal tails of these core histones are subject to a wide range of posttranslational covalent modifications.^{6,15} Histone modifications establish the global chromatin structure and help partition the genome into distinct domains of euchromatin where DNA is potentially accessible for transcription, and heterochromatin of inaccessible DNA. Best characterized modifications are acetylation and methylation at Lys and Arg residues and phosphorylation. Adding extra complexity, methylation can be in the form of mono-, di-, and trimethyl for Lys and mono- and dimethyl for Arg. Posttranslational modification functions by disrupting the contact between nucleosomes to unravel the chromatin and increase accessibility as well as by determining the recruitment and binding of enzymes and other nonhistone proteins that regulate gene activation or repression. Acetylation has the most potential to unfold chromatin as it neutralizes the basic charge of the lysine. Also, trimethylation of histone 3 lysine 4 (H3K4me3) at promoters is generally associated with transcriptional activity whereas trimethylation of histone 3 lysine 27 (H3K27me3) with transcriptional repression.⁶

In addition to histone modification, epigenetic control of transcription is attained through DNA methylation, most frequently on carbon 5 of cytosine in 'CpG' dinucleotides (cytosine followed by guanine in the 5' → 3' direction). Humans have 3 functional DNA methyl transferases that transfer the methyl group from S-adenosyl-methionine.^{16,17} DNMT1 (DNA methyltransferase 1) is the most abundant DNA methyltransferase in mammalian cells and adds methyl groups to hemimethylated CpG di-nucleotides; its main function is to maintain the methylation during DNA replication. DNMT3A and DNMT3B can methylate hemimethylated and unmethylated CpG, which are critical in establishing methylation states.^{16,18} In humans, 70–80% of CpG cytosines are methylated. A notable exception is the CpG island, defined as a DNA region of more than 500 base pairs with at least 50% of GC content. The methylation states of CpG islands, frequently located at promoter regions, are important for regulating gene transcription.^{17,19,20} Other forms of DNA methylation, such as cytosine methylation at non-CpG dinucleotides or 5-hydroxymethylcytosine,

have been described. Conversely, DNA demethylation is carried out by members of the ten-eleven translocation (TET) family of enzymes.²¹

1.2 | Epigenetic studies in T cells

Epigenetic changes occur with T cell activation and differentiation.²² The acquisition of effector and memory T cell functions requires not only that genes involved in lineage commitment are turned on but also that genes maintaining stemness are repressed.^{23–26} Consequently, DNA methylation as well as DNA demethylation and histone modifications conferring gene activation as well as repression are required for T cells to differentiate.²⁷ Equally important, the epigenetic code can act as the memory of cellular identity because it can be transmitted from one cell generation to the next,²⁸ obviously crucial for memory T cells that exhibit chromatin accessibility maps similar to effector T cells years after the inciting infection has been cleared.⁸

Epigenetic studies of aging so far have mostly focused on global measurements, such as histone expression or modification. With the exception for DNA methylation, an impediment for genome-wide profiling of locus-specific changes has been so far the need for high cell numbers. This has been a barrier in particular for human studies and for cell populations as heterogeneous as T cells that include numerous subsets of different states of differentiation, not to speak of the low frequencies of cells sharing the same antigen specificity. In recent years, progress has been accomplished that make such studies increasingly feasible. The ENCODE (Encyclopedia of DNA Elements) Consortium funded by the National Human Genome Research Institute has generated an impressive list of functional elements in the human genome in different cell types that provides a reference point for interpreting human epigenetic data. Equally important, techniques have been developed that can scale down to lower cell numbers. A prime example is the Assay for Transposase Accessible Chromatin with high-throughput sequencing (ATAC-seq),²⁹ a method for mapping chromatin accessibility genome-wide that even allows single cell studies³⁰ and that has been successfully used to track epigenetic changes in

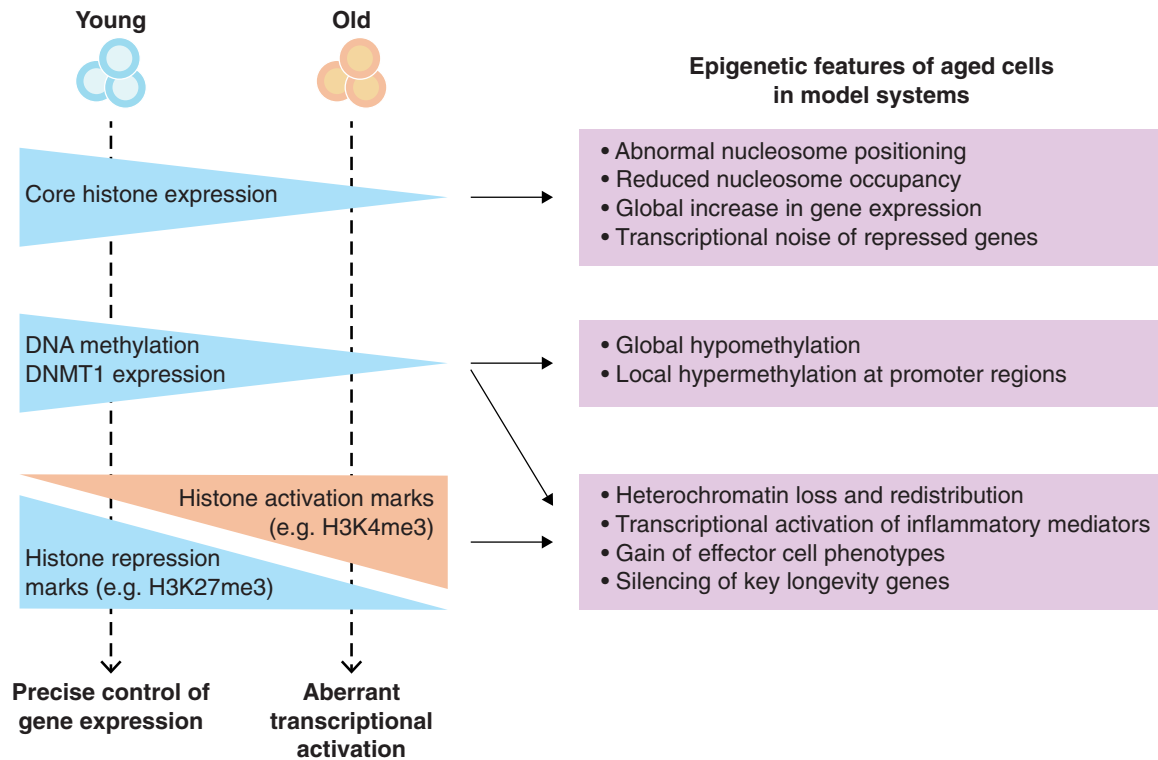


FIGURE 2 Epigenetic mechanisms in aging. Changes in chromatin structure due to altered histone expression, histone modifications, and DNA methylation occur with aging and contribute to cellular dysfunction

antigen-specific T cells after viral infection.^{8,31–34} Chromatin profiling strategies have also been improved to work with smaller cell numbers than conventional chromatin immunoprecipitation assays; Cleavage Under Targets and Release Using Nuclease (*CUT&RUN*) uses antibody-targeted controlled cleavage by micrococcal nuclease to generate specific protein–DNA complexes for paired-end DNA sequencing.³⁵

1.3 | Histone expression in model systems of aging

In a variety of aging models, a loss of core histone protein levels has been observed (Fig. 2).^{11,36–38} The loss in histones appears to be linked to cell division, possibly related to the tight control of histone transcription in the cell cycle with most of the transcription occurring in the G1 to S transition and down-regulated at cell cycle exit. Reduced histone expression has been shown in models as diverse as yeast replicative aging, mammalian models of cellular senescence, and muscle stem cells from old mice.³⁹ Replicatively aged yeast showed a global nucleosome loss of ~50%⁴⁰ and abnormalities in positioning of existing nucleosomes. Moreover, the epigenome of senescent cells characteristically includes splice variants of canonical histones that are incorporated into nucleosomes independent of replication.⁴¹ The importance of histone dose in the aging process is further supported by the finding that overexpression of histone H3 and H4, but not histone H2A and H2B, extends yeast replicative lifespan.⁴² Functional consequences of loss or fuzzy positioning of nucleosomes may reach from transcriptional noise to frank expression of repressed genes.^{40,43} Interestingly, increased transcriptional noise with age appears to be a feature of

post-mitotic cells, but not of actively replicating cells like stem cells or naïve T cells.⁴⁴ However, age-associated changes in nucleosome structure in senescent cells have been implicated in the transcriptional gene activation resulting in the so-called senescence-associated secretory phenotype that is characterized by the aberrant production of inflammatory mediators and contributes to the increased background inflammation in older individuals.⁴⁵ Data on histone expression and nucleosome structures with age in T cells are lacking, but will be of interest in particular for terminally differentiated effector T cells (TEMRA) that produce many inflammatory cytokines including those preferentially produced by innate immune cells.⁴⁶ It has been suggested that these T cells represent a convergence between innate and adaptive immunity, which may be driven by cellular senescence.^{47,48} So far, the technology to study nucleosome structures in infrequent cell populations has not been available, however, the recent development of ATAC-seq to generate chromatin accessibility maps in infrequent cell population has opened new opportunities and analytical approaches to derive information on nucleosome positioning.⁴⁹ Moreover, using ATAC-seq, Ucar et al. found significant chromatin closing with aging of several histone genes (*HIST1H3D*, *HIST1H3E*, and *HIST4H4*) consistent with the reduced expression of core histones in model systems of aging.⁵⁰

1.4 | Histone modifications in aging

Age-associated epigenetic changes encompass a broad decrease of heterochromatin, site-specific decrease of heterochromatin, as well as region-specific gains of heterochromatin (Fig. 2).⁵¹ Broadly

TABLE 1 Subset-specific differences of human CD4 and CD8 T cells with age

CD4 T cells	CD8 T cells
Circulating naïve cell number decline moderately	Circulating naïve cell number decline markedly
Distribution of memory cell subsets is stable	Effector memory and TEMRA cells increase, mostly due to stimulation with latent viruses
Central memory cells remain CD45RO positive	Central memory cells revert to CD45RA, masquerading as naïve CD8 T cells
Naïve T cell homeostasis dependent on recognition of MHC class II molecules	Naïve T cell homeostasis dependent on recognition of MHC class I molecules
Decline in TCR richness in naïve cells by 3–5 fold	Decline in TCR richness in naïve cells by 3–5 fold
Minor TCR repertoire oligoclonality in naïve cells	Increased TCR repertoire oligoclonality in naïve cells
CpG methylation changes at > 10,000 sites	CpG methylation changes at > 40,000 sites
Minor changes in chromatin accessibility in naïve and central memory cells	Naïve and central memory cells exhibit evidence of progressive differentiation in their chromatin accessibility patterns
Normal mitochondrial function (oxygen consumption rates) in naïve cells	Impaired mitochondrial function (reduced oxygen consumption rates) in naïve cells

interpreted, activating histone marks are gained and repressive marks are lost with age.^{11,38} In addition, gene-specific changes in chromatin states regulating expression of key longevity genes occur. Sun and colleagues compared young and old purified murine bone marrow hematopoietic stem cells by RNA-Seq, ChIP-Seq for histone modification and DNA methylation arrays.⁵² They found an accumulation of H3K4me3 with age, particularly on genes in which H3K4-trimethylation is already broad and are associated with stem cell self-renewal, letting the authors to suggest that stem cell aging epigenetically is a loss in differentiation capacity.

Human studies are mostly based on cultured cells that have reached senescence due to excessive replication or cellular stress. Cellular senescence is characterized by a state of cell cycle arrest⁵³ and characterized by a dynamic and imbalanced chromatin environment that is markedly different from the proliferating state. Many cultured mammalian cells develop senescence-associated heterochromatin foci, regions of highly condensed chromatin associated with heterochromatic histone modifications, heterochromatic proteins, and histone variants.^{54,55}

Studies of histone modifications on human T cells directly *ex vivo* are just in the beginning, as techniques for genomic-wide histone profiling from low cell numbers become available. Chromatin accessibility maps allow a broad assessment. Studies by Ucar et al., mostly on unfractionated peripheral blood mononuclear cells, revealed a systematic loss of chromatin accessibility at the promoters and enhancers of immune module genes and a gain in accessibility in the vicinity of genes that in the ENCODE data base are described as generally repressed or quiescent. Moreover, genes for several histone modifiers (EZH1, SETD7) were found to be less accessible that cause histone modification patterns similar to those seen with cellular aging.⁵⁰

Whether T cells reach the state of cellular senescence is difficult to ascertain. Effector T cells are end-differentiated and post-mitotic including the expression of cell cycle inhibitors like p16 and p21 and therefore difficult to distinguish from senescent cells. There is no evidence that human naïve CD4 T cells lose their ability to proliferate and develop features of cellular senescence. Epigenetic patterns associated with differentiation have been mostly examined for naïve CD8+ T cells. These studies describe a loss of activation-associated

histone modifications, such as H3K4me3 and H3K9ac, and a gain in DNA methylation and H3K27me3 modifications at transcription factors that are associated with stemness or naivety, such as *FOXO1*, *KLF2*, *LEF1*, and *TCF7*.^{22,25,56,57} Not surprisingly, the opposite histone modification pattern was seen for effector cell-associated transcription factors (*EOMES*, *TBX21*, and *PRDM1*) and functional effector genes (*GZMA*, *GZMB*, *PRF1*, *IFNG*). Moreover, transcription factor motif analysis showed an enrichment for *FOXO1* and *TCF1* at memory-specific enhancers and *TCF1* at naïve-specific enhancers. How this differentiation-associated histone modification pattern is different from aging remains to be seen. However, these data clearly emphasize the need to control for cell population heterogeneity in epigenetic aging studies, in particular for human CD8 T cells that experience a large loss in naïve and a gain in effector T cells with age (Table 1).

1.5 | DNA methylation in aging

Due to the availability of assay systems, genome-wide changes in DNA methylation are one of the best characterized epigenetic modifications in aging. Mammalian aging is generally associated with CpG hypomethylation, especially at repetitive regions of the genome in the heterochromatin paralleling the changes in histone modification (Fig. 2).^{58–61} This loss may be attributed to a decline in DNMT1 expression with age.¹⁸ It has been proposed that the loss of CpG methylation at repetitive sequences will heighten the risk of genomic instability due to retrotransposition events, although direct evidence in human aging is lacking.^{34,51} In contrast to this general demethylation, DNA methylation arrays have also identified regions of hypermethylation.^{9,38} These occur predominantly at promoter regions and are frequently tissue specific.⁶² These observations appear to be also pertinent for T cells. A comparison of CD4 T cells from newborns and centenarians found global decreases in DNA methylation with age, accompanied by heterogeneous DNA methylation in the centenarian genome.⁶¹ The majority of age-related changes occurred in CD8 T cells at CpG sites that correlated with the expression of effector molecules and transcriptional regulator genes with fundamental roles in CD8 T cell differentiation. An increased susceptibility of CD8 T cells to undergo epigenetic changes with age was also observed by Tserel et al.

who compared the methylome in purified CD4 and CD8 T cells from 50 young and 50 older adults using methylation arrays.⁶³ The authors identified approximately 4 times as many differentially methylated CpG sites in CD8 than in CD4 T cells (48,876 vs 12,275). Moreover, they found CpG methylation to be more variable in all CpG island sub-regions of CD8 T cells from older individuals. In this study, hypermethylation was mostly seen in CpG islands, while hypomethylated CpG sites were located at the border of CpG islands or in the gene body.

This increased age-associated variability in CD8 T cell may indicate that CD8 compared to CD4 T cells change more with age or it may reflect the increased population heterogeneity seen in CD8 T cells with age. Obviously, the two interpretations are not mutually exclusive. Consistent with the latter interpretation, CD4 TEMRA cells, generally considered to be senescent or end-differentiated, are less frequent than their CD8 counterparts but are similar in having reduced DNMT1 expression and reduced DNA methylation at effector molecules associated with cytotoxic function.^{64,65}

To understand whether age-associated DNA methylation is functionally important, Reynolds et al. identified potentially functional age- and cis-gene expression-associated methylation sites (age-eMS) by integrating genome-wide CpG methylation and gene expression profiles from circulating T cells and monocytes from individuals aged 55 to 94 years.⁶⁶ None of the age-eMS detected in 227 T-cell samples were detectable in 1264 monocyte samples suggesting that functional sites are tissue specific. Age-eMS tended to be hypomethylated with older age, located in predicted enhancers and preferentially linked to expression of antigen processing and presentation genes. In the studies by Tserel et al., age-related hypo- and hypermethylated sites were mostly mapped to regions with repressive histone marks as identified by ENCODE.⁶³ Accordingly, transcription of many of these genes was low or absent, suggesting that they are not involved in basic cell maintenance. However, because all of these studies were done in quiescent cells, these epigenetic changes could confer differences in responsiveness to stimulation. For a subset of genes that were expressed in CD8 T cells, Tserel et al. observed the expected inverse relationship between methylation and transcription. Again, most of the differentially regulated genes were related to T cell differentiation, i.e., gain of effector function (LGALS1, IFNG, CCL5, GZMH) and loss of naïve or central memory state (CCR7, CD27, TCF7, SAT1B) with age, either reflecting changes in CD8 T cell subset distribution or progressive differentiation within naïve and memory subsets with age.

Hannum et al. built a predictive model of the aging methylome from the blood of individuals aged 19 to 101 years and identified a set of 71 CpGs that have a high accuracy of age prediction and occur near genes associated with aging.⁶⁷ In a parallel study, Horvath et al. analyzed ~8000 samples representing 51 healthy human tissue and cell types including liver, kidney, immune and brain cells and ~6000 cancer samples and identified DNA methylation at 353 CpGs accurately predicted age.^{68,69} This signature has been coined as the epigenetic clock of aging and is independent of tissue function and stressors throughout lifetime. It is found in cell types with very different levels of replicative stress, setting it completely apart from cellular senescence. The function of these altered DNA methylation sites that appear to be tightly correlated to age remains elusive. By the nature of its tissue

non-specificity, the signature should be present in all T cell subsets irrespective of their differentiation state, however, specific studies on functional T cell subsets are lacking. We have explored whether these differential methylation sites coincide with sites that change in chromatin accessibility in CD8 T cells with age⁷⁰ and have not found any relationship (unpublished observation).

1.6 | Differential susceptibility of T cell subsets to undergo chromatin accessibility changes with age

Recent methodology advances have enabled mapping the regulatory chromatin landscapes that control gene expression. In particular, the assay for transposase-accessible chromatin by sequencing (ATAC-seq) can be applied to low cell numbers and even single cells to generate high-fidelity chromatin accessibility profiles and to derive conclusions on transcription factor networks that account for different cell states.²⁹ The technique has been successfully applied by us and others to define the epigenetic landscape of antigen-specific CD8 T cells as they differentiate from naïve T cells into functional effector and memory cells.^{8,31,32} Two manuscripts have been recently published that used this technique to describe how the epigenetic landscapes of T cells change with aging and whether these changes allow conclusions on the mechanisms and regulatory transcription factor networks involved.^{50,70} Ucar and colleagues compared chromatin accessibility maps in PBMC of twenty-eight 22 to 40-year-old healthy individuals and 21 individuals older than 65 years and identified 12,626 differentially accessible sites (9% of those tested) with approximately an equal number of sites opening or closing with age. Sites with increased accessibility were frequently subject-specific and located at less accessible chromatin region whereas closing sites mapped to promoter and enhancer regions that were shared between individuals. As discussed above, differentially open sites included histone and histone modifier genes as well as increased accessibility to heterochromatin regions, suggesting that the generic epigenetic aging pathways discussed above for aging model systems also apply to T cells. However, the vast majority of genes in the vicinity of differentially open sites were genes that encode for molecules critical for immune function. Interestingly, PBMC subsets were not equally affected. Ucar et al. followed up with an analysis of CD4 and CD8 T cell subset in a smaller cohort and found very few age-associated changes in CD4 T cells. In contrast, CD8 T cells and in particular CD8 memory T cells showed extensive chromatin remodeling and differentially open genes correlated with those found in PBMC. Many genes found to change in accessibility and expression with age were related to T cell differentiation; for example, the age-associated declines in the transcription factors LEF1 and TCF7 and the IL-7 receptor are also hallmarks of effector T cell differentiation as is the increase in cytotoxic mediators. Whether this age-associated differentiation is driven by a limited set of transcription factors is unknown. One possible candidate is FOXO1 that controls expression of many of the genes associated with stemness, including IL-7R. FOXO1 deficiency in mice is associated with a failure to maintain naïve T cells or to generate memory cells.^{71–73} In preliminary studies, we have identified miRNAs that change with age. Pathway analysis of

the genes regulated by these miRNAs has identified enrichment for the FOXO1 pathway.⁷⁴

The differential susceptibility of CD4 and CD8 T cells to age-associated epigenetic changes reflects the different biology of these cell subsets (Table 1). The age-associated loss in naïve T cells is much more dramatic for CD8 T cells.^{75,76} In fact, the loss in circulating naïve CD8 T cells was the major age-associated immunological marker of all variables tested in a comprehensive immune analysis of 243 healthy individuals.⁷⁷ Also, the increase in effector T cells and in particular TEMRA cells is characteristic for CD8 T cells, but very minor for CD4 T cells. Moreover, the phenotypically defined naïve CD8 T cell compartment in older individuals includes increased frequencies of clonally expanded populations that may represent either true or virtual memory cells and that is rarely seen for naïve CD4 T cells.^{78,79} The mechanism underlying these different subset behaviors, which is characteristic for human but not murine T cell aging, is unknown.

1.7 | Epigenetic signatures of cellular differentiation in CD8 T cell aging

We performed a more detailed analysis of CD8 T cell aging to identify transcription factor networks that correlate with chromatin accessibility landscapes.⁷⁰ In these studies, we compared naïve, central memory and effector memory CD8 T cells in young and older healthy adults. TEMRA were excluded because this state is highly dependent on CMV infection rather than on age. We excluded all peaks that were only found in one sample, therefore focusing on functional sites, and we excluded sex chromosomes, which have been shown to account for much of interindividual variation.⁸⁰ Hierarchical clustering of open sites segregated the 3 T cell subsets without clear impact of age, demonstrating that variability related to differentiation states by far outweighed that of age. These data re-emphasize the need for separately analyzing subpopulations, in particular because the subset composition of CD8 T cells changes with age. However, principal component analysis showed segregation by differentiation state as well as age in that old naïve and central memory T cells appeared to be more differentiated than those from young individuals. Direct comparison identified age-related differences for naïve and central memory CD8 T cells, but not for effector T cells. Transcription factor motif analysis of differentially open sites identified basic leucine zipper domain (bZIP) family motifs enriched at sites more open and E26 transformation-specific (ETS) family members at sites more closed in ages compared to young naïve and central memory cells, a transcription factor motif pattern that largely resembles that seen with differentiation from naïve to memory T cells. Interestingly, T-box family members, such as TBX21 and EOMES, also hallmarks of differentiated cells, did not come up in the age analysis, either because the age-associated differentiation is incomplete or because our analysis was not sufficiently powered to detect an enrichment. Together with the findings by Ucar et al. that TCF/LEF1 accessibility and FOXO-dependent IL-7R expression is lost with aging, our data suggest that one major dimension of CD8 T cell subset aging is progressive differentiation, i.e., naïve T cells have lost complete stemness and central memory T cells assume features of effector T cells with age. Single cell analysis will have to be

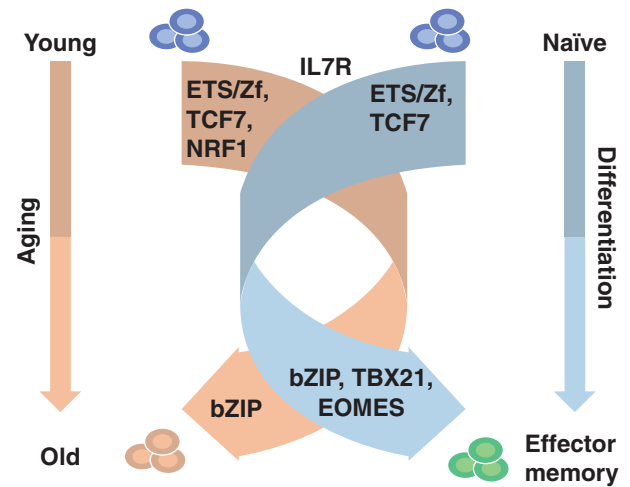


FIGURE 3 The chromatin landscape in CD8 T cell differentiation and aging. T cell differentiation is associated with major changes in chromatin accessibility. Age-associated changes are smaller by an order of magnitude, but exhibit similar patterns suggesting that transcription factor networks involved in T cell differentiation also drive T cell aging

performed to show whether this signature reflects increasing cell heterogeneity within each subset. Contamination with age of memory T cells that are phenotypically naïve may contribute,^{8,78,81} but is unlikely the only reason for this phenomenon. More likely, CD8 T cells enter progressive differentiation with age in absence of an exogenous antigenic driver, reminiscent of virtual memory T cells in the mouse. As Ucar et al. have shown and unpublished results from our lab confirm, the age-associated differentiation is a feature of CD8 T cells and much less prominent in CD4 T cells.⁵⁰ In conclusion, T cell aging involves gene regulatory pathways that drive T cell differentiation and the increased susceptibility of CD8 T cells to age-associated changes appears to be a heightened inducibility of these pathways (Fig. 3). This shift to differentiation is also seen at the transcriptome level, although less robust than with the epigenetic markers. Obviously, the relationship between chromatin accessibility and transcriptome is complex and not linear. It is one of the characteristic features of T cells that effector genes are poised in memory cells but not actively transcribed. However, we have found an increased transcription of BATF target genes in older naïve CD8 T cells consistent with increased accessibility to bZIP motifs.⁷⁰

A second dimension of CD8 naïve and central memory T cell aging in these studies was a reduced chromatin accessibility at promoters that frequently involved a nuclear respiratory factor 1 (NRF1) binding site.⁷⁰ Interestingly, the NRF1 motif includes CpG sequences and knockdown experiments of DNMT1 have shown that NRF1 binding at selected promoters is more sensitive to DNA methylation than that of other transcription factors.⁸² It is therefore possible that the reduced accessibility is related to the increased CpG methylation that is seen at selected promoters with age.⁶³ NRF1-binding sites mostly locate to promoters and not enhancers consistent with NRF-1's role in regulating basic cell functions. In particular, NRF1 controls the expression of many mitochondrial genes, including the genes of the mitochondrial respiratory chain (MRC).^{83–85} Indeed, in RNA-seq experiments we

found reduced expression of MRC genes with age. Moreover, aged naïve CD8, but not CD4 T cells have impaired mitochondrial function as seen in reduced oxygen consumption rates in Seahorse assays. In addition to changes in homeostatic pathways associated with T cell differentiation, such metabolic changes could also contribute to the accelerated loss of naïve CD8 T cells seen with age.

2 | CONCLUDING REMARKS

Over the last decade, it has become clear that life span is at least in part epigenetically determined. Changes in the epigenome have a large influence on the aging process. Age-associated changes in the level of histone protein concentrations as well as in DNA methylation and histone modifications alter chromatin structure and local accessibility. Most recently, new technological developments have improved our ability to perform genome-wide gene-specific epigenetic studies in infrequent cell populations, such as T cell subsets. In particular, chromatin accessibility mapping by ATAC-seq has been informative to define the epigenetic state of naïve T cells versus effector or memory T cells and follow the chromatin changes that occur in antigen-specific T cells when they are activated in a viral infection and differentiate into various effector T cells and memory T cells. These studies have led to the recognition that T cells undergo huge changes in chromatin structure with more than 20% of all accessible sites either opening or closing. Since T cell population compositions change with age, these large differences need to be controlled for when studying the influence of age on the T cell epigenome. Initial ATAC-seq studies on T cell subpopulations have provided evidence that T cells also acquire some of the key epigenetic changes thought to be causative for aging in model systems, such as the down-regulation of repressive marks; however, typical epigenetic marks of cellular senescence are largely elusive in T cells. In contrast, signatures that are characteristic for the differentiation process are gained with age and outnumber age-specific marks. Interestingly, there is a large difference in CD4 and CD8 T cell subsets to acquire these signatures, consistent with the observations that CD8 T cells are more susceptible to undergo age-associated functional changes (Table 1). Obviously, heterogeneity within phenotypically defined population need to be further studied. However, these data raise the interesting concept that the major aging process in T cells is the aberrant activation of transcription factor networks that generally drive the differentiation process after T cell activation, i.e., the major component of T cell aging is the failure to maintain stemness and the entering of a differentiation process.

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DISCLOSURE

The authors declare no conflict of interest.

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