

Single-cell genomics in acquired bone marrow failure syndromes

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Mechanistic studies of immune bone marrow failure are difficult because of the scarcity of residual cells, the involvement of multiple cell types, and the inherent complexities of hematopoiesis and immunity. Single-cell genomic technologies and bioinformatics allow extensive, multidimensional analysis of a very limited number of cells. We review emerging applications of single-cell techniques, and early results related to

disease pathogenesis: effector and target cell populations and relationships, cell-autonomous and nonautonomous phenotypes in clonal hematopoiesis, transcript splicing, chromosomal abnormalities, and T-cell receptor usage and clonality. Dense and complex data from single-cell techniques provide insights into pathophysiology, natural history, and therapeutic drug effects.

Introduction

Inability to produce blood cells follows from chemical and physical damage (as with cytotoxic drug therapies and radiation), as a component of constitutional syndromes (classically Fanconi anemia and the telomere biology disorders), or as an acquired disease. Acquired bone marrow failure (BMF) diseases include aplastic anemia (AA), (hypoplastic) myelodysplastic syndrome (MDS), paroxysmal nocturnal hemoglobinuria, pure red blood cell aplasia and other single-lineage syndromes, and large granular lymphocytic leukemia (LGLL).¹ Patients typically respond to immunosuppression: these diseases are more specifically categorized as immune BMF syndromes.¹⁻⁶ Their pathogenesis is broadly understood from decades of laboratory studies using traditional methods of cell culture, functional assays, immunophenotyping, and molecular biology using blood and marrow samples, as well as animal models.⁷⁻²⁵ However, scarcity of marrow cells, the heterogeneity of hematopoietic and immune system elements, and the complexity and variability of intrinsic cell behaviors and cell-cell interactions have been major limitations to deeper understanding of disease processes.

Conventional laboratory methods require in vitro manipulation: physical cell separation, exposure to nonphysiologic conditions of oxygen and temperature, concentrations of growth factors, culture media, other cell populations and cell densities, and regenerative stress. Laboratory experiments are optimized to provide measurable outputs in vitro, which are assumed to correlate with in vivo physiology and pathophysiology. Optimization also entails simplification, and conventional assays consequently generate low dimensional and single-layer data that cannot identify the complex parallel processes at play. Absence of specific cell-membrane markers of cytogenetically

or genetically abnormal cells has hindered examination of dysregulated molecular mechanisms. Thus, familiar techniques, or gold standards, have considerable deficiencies.

Recent rapid, often startling, advances in single-cell methods are based on genomics, large-scale and deep sequencing of DNA and RNA, and associated protein detection. Single-cell studies coupled with bioinformatics generate extensive, multi-dimensional, and multiomic information from limited numbers of cells, an ideal approach to study BMF. Genomic approaches have encountered some skepticism, in part because of the massive amounts of data, reliance on mathematical calculations, "noise," and the peculiarities of the workflow. Most of the experimenters' involvement begins after the "wet" laboratory work is completed, the experimental designs may purposely avoid hypothesis testing, and cooperation must be achieved between (nonquantitative) biologists and computational analysts (untrained in biology). Single-cell RNA sequencing (scRNA-seq)-related data should be broadly consistent with results from conventional experiments and our understanding of pathophysiology, but new genomic methods should also reveal novel and unanticipated phenomena (Figure 1). A brief summary of background knowledge of BMF diseases is shown in Table 1.

Immune AA

In acquired AA, the initiating antigenic targets of the immune response cells are unknown. Antigenic targets and potential viral infections can be inferred from T-cell receptor (TCR) usage: TCR clones that are individual-public (shared among patients) and/or disease specific (common among patients and absent in other populations) would implicate a common initiating antigen. However, in a study using scRNA-seq and scTCR $\alpha\beta$ -seq (scRNA + TCR $\alpha\beta$ -seq),⁶⁴ the epitope specificities of individual-private (not

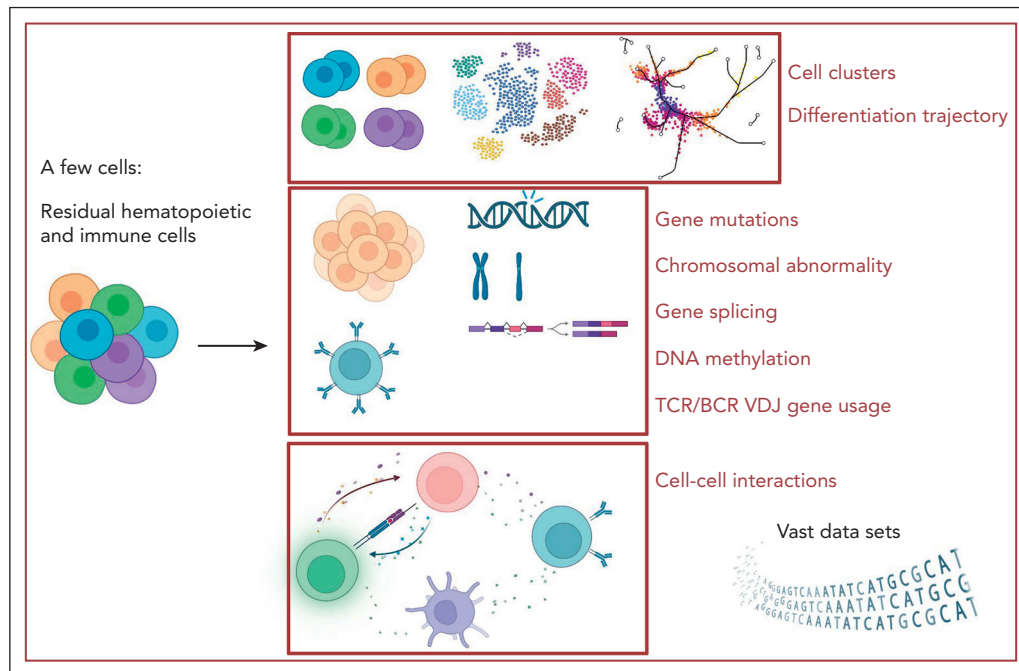


Figure 1. Single-cell multiomics study in BMF syndrome. By starting with just a few cells, single-cell multiomics studies can yield a wealth of information on various aspects of BMF syndrome diseases and treatment: vast data sets, cell clusters, hematopoietic differentiation trajectory, chromosomal abnormalities, gene mutations, gene splicing, DNA methylation, TCR/B-cell receptor (BCR) variable diversity joining (VDJ) gene usage, and cell-cell interactions. Figure created with [BioRender.com](https://www.biorender.com).

shared among individuals) response clonotypes were unlikely to be a common viral antigen but a more homogenous target population within the clones of patients with AA.⁶⁴ Most T cells with private response clonotypes had an activated CD8⁺ effector phenotype, characterized by expression of *GZMH*, *GNLY*, and *PRF1*. Private response clonotypes were suppressed in a patient responding to immunosuppression and increased in a patient who was not responding. In a screen for somatic mutations in AA, variants were found to be common in both patients and healthy controls but enriched in CD8⁺ T cells in AA, and they were located in the JAK-STAT and MAPK pathways.⁶⁵ Mutation burden was associated with CD8⁺ T-cell clonality. Paired scRNA + TCR α -seq in patients with *STAT3* or other mutations in CD8⁺ T cells linked clonotypes with phenotypes. In 2 index patients, somatic *STAT3* mutations were restricted to a single CD8⁺ T-cell clone. Phenotypically, *STAT3* mutations associated with CD8⁺ terminally differentiated effector memory T cells, which exhibited enhanced expression in pathways of immune response, cytotoxic, and lymphocyte activation. With immunosuppression, TCRVB clones carrying *STAT3* mutations decreased in 1 case on normalization of blood counts but further increased in another patient during response and later relapse.

Subpopulations of CD8⁺ and CD4⁺ T cells in AA have been imputed from single-cell data to directly interact with hematopoietic stem and progenitor cells (HSPCs). In pediatric AA cases, mass cytometry (cytometry by time of flight) identified a subgroup of noncanonical CD4⁺ naive T cells with elevated expression of pNFkB529 and pSTAT3Y705.⁶⁶ Using 5' scRNA-seq of CD3⁺ BM mononuclear cells (BMMNCs), activation of the JAK3/STAT3 pathway in Th17-polarized CD4⁺ naive T cells in patients with severe AA (SAA) was observed. Proteomics and metabolomics analyses of plasma and BM supernatants from

patients with SAA were the basis for another scRNA-seq experiment.⁶⁷ Differential proteins and metabolites in SAA were related to energy metabolism, the complement and coagulation cascades, and hypoxia-inducible factor (HIF)-1 α signaling pathways. On reanalyzing scRNA-seq data, these pathways were enriched in T cells from patients with AA. A highly activated CD38⁺CD8⁺ T-cell subset, which was increased in AA and a murine model of AA, contained genes relating to T-cell activation (the glycolysis or gluconeogenesis pathway, HIF-1 α signaling, and the complement-associated pathways). Zhu et al sequenced sorted single HSPCs and T cells from patients with AA.⁶⁸ CD4⁺ T cells showed upregulation of genes associated with antigen presentation and cell death regulation, whereas CD8⁺ T cells displayed high expression of genes associated with cytokine production. There were increased interactions between HSPCs and T cells in AA, including Fas/Fas ligand and tumor necrosis factor (TNF) receptors/TNF- α , already implicated in immune-mediated disruption of hematopoietic cells; some of these ligand-receptor interactions were affected by treatment.

Immune cells do not function in isolation but operate within complex and dynamic networks, which can be recognized in single-cell data. Using high-dimensional mass cytometry and subcluster frequency correlation analyses of the BM, 2 cell networks were identified in AA.⁶⁹ Network AA was composed of CD16⁺ myeloid cells, CCR6⁺⁺ B-cells, Th17-like CCR6⁺ memory CD4⁺ T cells, and KLRG1⁺ terminally differentiated effector memory CD8⁺ T cells. These cells were increased in AA before immunosuppressive therapy, and with hematologic response, the immune cell compartment largely normalized, with reduced numbers of CD16⁺ myeloid cells. In a single-cell transcriptomic analysis focused on natural killer (NK) cells from

Table 1. Summary of background knowledge of BMF diseases

Disease	Features	Pathophysiology
Acquired AA	Characterized by pancytopenia and BM hypocellularity, and results from cytotoxic T cell-mediated destruction of HSPCs ¹⁻¹³	Type-1 cytokines, such as IFN- γ , can directly inhibit HSPC function, for example, by blocking hematopoietic growth factor signaling. ¹⁴⁻²¹
	Of patients with SAA, ~80% respond to immunosuppressive therapy alone or combined with eltrombopag ³⁻⁶	Regulatory T cells that suppress effector T cells are reduced in AA, and increase with IST. ^{22,23}
MDS	Originates from a stem cell, often mutated in ≥ 1 myeloid neoplasm genes	Like AA, abnormalities (involving cytotoxic T cells, TNF, interleukin-1, and others) have implicated immune effects in suppression of hematopoiesis. ²⁶⁻²⁸
	Transformation to AML is common in higher-risk MDS	
	Most patients have lower-risk MDS, and pancytopenia (usually anemia) because of ineffective hematopoiesis is a common feature. ^{29,30}	
	Approximately 20% of MDS is hypoplastic, resembling (and often confused with) AA in BM hypocellularity, and also in the specific cassette of frequently mutated genes, chromosome abnormalities, relatively favorable prognosis, and responsiveness to IST, as compared with classical cellular MDS. ^{31,32}	
T-LGLL	Lymphoproliferative disease that typically presents with cytopenia	Sequencing of the antigen-binding region (complementarity-determining region 3) and measurement of the variable β chain of the TCR by flow cytometry have defined clonality in LGL, but high-resolution profiling of the TCR repertoire in T-LGLL has been lacking because of limitations of the antibody panel, missing paired chain information, and heterogenous clones among individuals.
	Characterized by clonal expansion of terminally differentiated effector-memory cytotoxic lymphocytes. ^{33,34}	Using single-cell methods, it has been possible to generate a comprehensive landscape of T-cell clones, TCR-usage sharing among patients, clonality correlations with T-cell phenotypes, and evaluation of molecular mechanisms in responders to treatment.
CHIP	Prevalent in older individuals and associated with increased risks of hematologic malignancies and all-cause mortality. ^{35,36}	
	Most common mutated genes in CHIP, <i>DNMT3A</i> , <i>TET2</i> , and <i>ASXL1</i> , are all epigenetic modifiers, and they are also frequently mutated in BMF syndromes such as AA and MDS. ³⁷⁻⁴¹	
VEXAS	Recently described severe adult autoinflammatory syndrome	Cytopenias and progressive BMF are common in VEXAS. ⁴²⁻⁴⁴
DBA	Rare congenital red blood cell hypoplastic disease featuring anemia, macrocytic erythrocytes, elevated erythrocyte adenosine deaminase activity, with short stature, physical abnormalities, and predisposition to cancer. ⁴⁵⁻⁴⁷	Most cases carry mutations in genes encoding the small 40S ribosomal protein subunit or the large 60S ribosome protein subunit. P53 activation resulted from abortive ribosome assembly and nucleolar stress have been implicated in pathogenesis. ⁴⁸⁻⁵³
GATA2 deficiency	Constitutional GATA2 deficiency has a broad spectrum of clinical phenotypes, including systemic infections, lymphedema, cytopenias, and myeloid neoplasm. ⁵⁴⁻⁵⁸	Constitutional GATA2 deficiency is caused by heterozygous germ line GATA2 mutations. ⁵⁴⁻⁵⁸
DADA2	Monogenic vasculitis syndrome with clinical features including vasculitis and vasculopathy, recurrent cardiovascular accidents, systemic inflammation, immune deficiency, and hematologic abnormalities. ⁵⁹⁻⁶²	The disease phenotypes are caused by reduced ADA2 activity due to autosomal-recessive loss-of-function mutations in the <i>ADA2</i> gene. ⁵⁹⁻⁶²
Telomere biology disorders	Complex set of constitutional syndromes defined by the presence of very short telomeres, with high risk of BMF, pulmonary fibrosis, and hepatic abnormalities. ⁶³	Pathogenic germ line variants in genes involved in telomere maintenance (such as <i>DKC1</i> , <i>TERC</i> , <i>TERT</i> , <i>NOP10</i> , and <i>NHP2</i>) can lead to telomere erosion, and persistent DNA damage and stem cell decline. ⁶³

DBA, Diamond-Blackfan anemia; IST, immunosuppressive therapy; T-LGLL, T-cell large granular lymphocyte leukemia.

the peripheral blood (PB) and the BM of patients with SAA,⁷⁰ 8 clusters of NK cells were identified, indicating remarkable cellular heterogeneity. NK cell numbers in both the PB and BM were reduced in SAA, and their cytotoxic function was downregulated.

Regulatory T cells downmodulate autoreactive T cells, a mechanism of central tolerance, and they are decreased in many autoimmune diseases, including AA.^{22,23} Recent studies have highlighted the immune suppressive functions of regulatory B cells (Bregs). CD19⁺CD24^{hi}CD38^{hi} Bregs can suppress cytotoxic T lymphocytes and Th1 responses and promote conversion of CD4⁺ T cells to regulatory T cells via interleukin-10, PDL1, CD80, CD86, and CD1d.⁷¹⁻⁷⁵ Bregs are reduced in AA, particularly in very severe disease, but residual Bregs remain functional and produce interleukin-10.⁷⁶ In scRNA-seq analysis of the BM cells of 2 patients with SAA,⁷⁷ focusing on B-cell receptor and variable diversity joining genes, the highest pairing frequencies were between IGHV3-20-IGKJ2, IGHV3-20-IGKJ4, and IGHV3-20-IGHLJ2, and 3 V genes (IGHV3-7, IGHV3-33, and IGLV2-11) had elevated expression in B cells of patients with AA. The ligand–receptor pairs of B cells with hematopoietic cells involved antigen presentation, inflammation, apoptosis, and proliferation of B cells. This study was limited by the small number of patients and lack of correlation of B-cell receptor usage with B-cell phenotypes. Cell cross talk appears to have a crucial role not only in immune responses and inflammation in BMF syndrome but also in the pathogenesis of clonal hematopoiesis (CH).

Genes coding for RNA splicing factors are frequently mutated in CH of indeterminate potential (CHIP) and in myeloid malignancies.^{78,79} Spliceosome genes have been reported as differentially expressed in HSPCs from patients with AA; full-length scRNA-seq of HSPCs showed altered isoform usage for thousands of genes.⁶⁸ When the splicing spectrums of aggregated HSPCs of patients with AA and MDS were compared, there were shared altered splicing events, and the affected genes were associated with DNA damage and repair response (*FANCG*, *ATF2*, and *RFC1*) and cell cycling signals. These results suggested a possible mechanism of AA progression to MDS. In addition, in AA there was downregulation of genes regulating poly-A tail shortening in AA HSPCs, and for many genes, altered poly-A tail usage associated with DNA repair signaling.⁶⁸

MDSs

scRNA-seq has been applied to define the transcriptome in lineage-negative BMMNCs in MDS; features included upregulation of neutrophil granule genes and downregulation of ribosomal genes in MDS.⁸⁰ In a large cohort of patients with MDS,⁸¹ scRNA-seq was used to validate the 2 distinct differentiation patterns in 2 representative patients from their lineage-negative CD34⁺ HSPC compartments. In common myeloid progenitor–pattern MDS, the cells atop the HSPC hierarchy maintained the transcriptional profile of the most immature long-term repopulating hematopoietic stem cells (HSCs), including expression of *MLLT3*, *PBX1*, and *HLF*. In granulocytic-monocytic progenitor–pattern MDS, these cells expressed myeloid-affiliated genes in the lymphoid-primed multipotent progenitor population, including *CEBPA* and

CSF3R. Pseudotime analysis of HSPCs from patients with MDS showed trajectories that converged at the myeloid progenitor state, consistent with similar myelomonocytic differentiation potentials and the clinical phenotypes of the 2 groups of patients with MDS. These findings were extended using mouse models and ex vivo perturbations to identify molecular drivers in blast progression after failure of frontline hypomethylating agent treatment.

Spliceosome genes are more frequently mutated in MDS than in AA. Among these mutated genes, *SF3B1*, a core component of the spliceosome complex, remains most prevalent across hematologic malignancies and solid tumors.⁸²⁻⁸⁴ Splicing aberrations have been documented in a recent advanced multiomics single-cell approach in samples with mutated *SF3B1*.⁸⁵ GoT-Splice, integrates genotyping of transcriptomes with enhanced efficiency for long-read single-cell transcriptome profiling, with proteogenomics (cellular indexing of transcriptomes and epitopes by sequencing). This new technique allows simultaneous profiling of gene expression, cell surface protein markers, somatic mutation status, and RNA splicing within individual cells, overcoming limitations of 3′- or 5′-biased short-read sequencing. *SF3B1*-mutated cells in the megakaryocytic-erythroid lineage showed increased fitness, as inferred from upregulation of genes involved in cell cycle and messenger RNA (mRNA) translation. *SF3B1*-mutated cells also had aberrant 3′ splicing site usage. Disruptive and pathogenic *SF3B1* mutation–driven missplicing affected key mediators of hemoglobin synthesis and differentiation at all stages of erythroid maturation. The single-cell approach enabled the detection of erythroid lineage bias and cell type–specific cryptic 3′ splice site usage in *SF3B1*-mutated cells in patients with CH, preceding the development of overt MDS.

Complex clonal and molecular landscapes in MDS and other myeloid malignancies have been described from next-generation sequencing. As inferred from bulk DNA sequencing and bioinformatic analyses, mutations are acquired stepwise, but these methods cannot discriminate mutations in the same clone or define the sequence of mutation acquisition. Somatic mutations are common in patients with MDS, and many patients carry multiple mutations. Coexistence of splicing factor mutations in patients with myeloid malignancy can be inferred from both bulk and single-cell DNA sequencing (scDNA-seq) analyses.⁸⁶ In the majority of cases, mutations in splicing factor genes were mutually exclusive, with <1% of patients carrying 2 concomitant mutations (~50% of such double mutations were found in the same individual cells). Patients with double mutations showed selection against the most common alleles and selection for less common alleles, preserving 1 wild-type allele. A possible functional basis for the coexistence of splicing factor mutations is that *SF3B1* and *SRSF2* alleles, which are enriched in patients with double mutations, have a reduced impact on RNA splicing and/or binding compared with more common alleles.

In a study using scDNA-seq to evaluate the clonal dynamics of pathogenic mutations in 2 patients with MDS,⁸⁷ clonal heterogeneity of pathogenic mutations, including *FLT3-ITD*, *IDH2*, *EZH2*, and *GATA2*, was associated with disease progression and resistance to hypomethylating agent therapy, and was accompanied by copy number loss in *DNMT3A*, *TET2*, and

GATA2. scDNA-seq detected rare cell clones and mutations that were undetectable by bulk tumor sequencing. To further investigate the clonal framework of myeloid malignancies, scDNA-seq of 31 frequently mutated genes was performed in 146 samples from 123 patients with myeloid malignancies, including CHIP, myeloproliferative neoplasm, and acute myeloid leukemia (AML).⁸⁸ AML was dominated by a small number of clones, which frequently harbored cooccurring mutations in epigenetic regulators. Mutations in signaling genes were often present more than once in distinct subclones, consistent with increasing clonal diversity. Simultaneous scDNA-seq and immunophenotyping revealed differential lineage contributions of *DNMT3A* R882 (myeloid bias) and *DNMT3A* R635Q (less in myeloid and B-cell lineages).

Chromosomal abnormalities are typical of cancer and hematologic neoplasms, and also occur in BMF.⁸⁹⁻⁹² The presence of complex cytogenetics and monosomy 7 is prognostic of refractory cytopenia, clonal evolution to MDS/AML, and an adverse prognosis in AA.³ Assessing the functional implications of these cytogenetic abnormalities at the cellular level is difficult because of the absence of markers to distinguish abnormal cells from diploid cells. scRNA-seq allows identification of aneuploid cells, by analysis of relative global gene expression levels, copy-number variation, and loss of heterozygosity. Monosomy 7 cells in patients with MDS, including 2 cases of de novo MDS and 3 cases with clonal evolution from AA, had diverse differentiations patterns and showed downregulation of genes involved in immune response, DNA damage checkpoints, and apoptosis pathways.⁹³ Monosomy 7 cells also displayed downregulated long noncoding RNAs associated with immune response, cell apoptosis and cell death, and DNA modification,⁹⁴ suggesting coordinated mRNA and long noncoding RNA transcription in the regulation of cellular functions. Monosomy 7 and trisomy 8 are frequent chromosomal abnormalities in GATA binding protein 2 (GATA2) deficiency, a constitutional disease with immunologic and hematologic manifestations, and they correlate with disease prognosis and malignant transformation. scRNA-seq of HSPCs in patients with GATA2 deficiency provided molecular signatures of monosomy7, trisomy 8 cells, and complex cytogenetic abnormalities.⁹⁵

T-cell LGLL

scRNA + TCR $\alpha\beta$ -seq profiling was used to analyze sorted CD45⁺ PB mononuclear cells and CD3⁺ T cells from patients with T-cell LGLL (T-LGLL) in 2 recent companion studies from the National Institutes of Health and the University of Helsinki. Their data are complementary: the American team examined patients before and after effective therapy, and the Finnish group examined a wider range of cell types and also included other autoimmune diseases and hematopoietic malignancies.^{96,97} In both studies, bioinformatics was conducted in conjunction with bulk RNA-seq and TCR β -seq data; flow cytometry, serum protein profiling, and ex vivo validations provided complementary data. TCR $\alpha\beta$ -seq analysis provided high-resolution profiling of individual clones and allowed for flexibility in adjusting the threshold for comparisons. TCR clones (at least 2 cells with identical TCRs) and expanded clones (at least 10 cells with identical TCRs) were identified in patient samples. T-LGLL has been hypothesized to be driven by chronic antigen exposure, and efforts have been made to identify

shared antigens imputed from common TCR sequences. However, in both studies T-LGLL clonotypes were restricted to individual patients (and therefore private), and no structural amino acid-level similarities were identified (no disease-specific clones), even when the analysis focused only on 43 HLA-A*02⁺ T-LGLL clones.⁹⁶ These results imply a lack of common clonotypes in T-LGLL.^{96,97} TCR clones in T-LGLL are present in healthy donors but at very low frequencies,⁹⁷ and antigen-driven clonotypes are even more frequently observed in healthy controls than among nonantigen-driven clonotypes in T-LGLL.⁹⁶ Antigen-driven clonotypes defined in T-LGLL might recognize commonly encountered antigens, including cytomegalovirus pp65.

Single-cell analysis has directly linked phenotypes to clonotypes. In our study, T cells belonging to the same clonotype (with identical TCR sequences) had similar transcriptional phenotypes and they occupied a confined region in a t-distributed stochastic neighbor embedding projection: TCR use may affect T-cell phenotypes.⁹⁷ On diffusion mapping, T-cell activation and TCR usage were the main components contributing to T-cell phenotypes, with the most expanded clones being effector memory or activated T cells. In the Finnish study, in contrast to the positive correlation of TCR clonality with an effector memory phenotype observed in AA⁶⁵ and in our study of T-LGLL,⁹⁷ clonally expanded T cells appeared more phenotypically diverse than in healthy donors, but they had higher expression of proliferation, activation, and exhaustion genes, and lower expression of antiapoptosis genes.⁹⁶ We classified clone dynamics (based on clone size changes) after treatment with alemtuzumab into 3 patterns: increasing, decreasing, and unchanged. Clones with increasing sizes showed upregulation of genes enriched in immune response and cell activation, whereas these genes were downregulated in unchanged and decreased clone groups.⁹⁷ Expanding, antigen-driven wild-type *STAT3* clones had higher cytotoxic gene expression than in the decreasing *STAT3* mutated clones.⁹⁶

Various cytokines and chemokines were elevated in T-LGLL, likely produced by monocytes and dendritic cells rather than by T cells, and these cytokines can remain elevated after treatment, despite suppression of T cells and a hematologic response.⁹⁷ The nonleukemic immune cell repertoire likely also has a role in T-LGLL pathogenesis; T cell-derived interferon gamma (IFN- γ) may drive activation of nonleukemic immune cells. T-LGLL clones had elevated predicted cell-cell interactions and many costimulatory interactions with other immune cells.⁹⁶ scRNA + TCR $\alpha\beta$ -seq has expanded our understanding of TCR usage, T-cell clonality with phenotype and activation, and clonal dynamics with treatment.

CH

Experiments in human CH can be problematic because of phenotypic and transcriptomic similarities between mutated and wild-type cells, which make it difficult to isolate an abnormal population by morphology or cell surface markers. Mutated clones at low variant allele frequency are diluted in bulk cell experiments. Although the exact mechanisms by which somatic mutations disturb hematopoietic homeostasis are not yet fully understood, both cell-intrinsic and non-cell-intrinsic effects of mutations, including interactions between mutated

cells and the BM environment, likely are important. Multimodal single-cell sequencing techniques can simultaneously detect gene mutations, gene expression, and proteins, and, thus, integrate genotype–phenotype correlations, differentiation bias, and associations among different types of cells.

Direct comparison of mutated clones with wild-type cells at the single-cell level in the same individual has shown proliferative advantages and lineage bias of mutated cells.⁹⁸ *TET2*-mutated HSCs were shifted toward a more differentiated state in pseudotime, with downregulated long-term HSC signatures; these mutated clones expanded further in multiple downstream progenitors. Upregulation of myeloid lineage–affiliated transcription factors (*CEBPD* and *IRF8*) in *TET2*-mutated granulocytic-monocytic progenitors may be the basis of myeloid skewing early in differentiation. The clone size of *DNMT3A*-mutated cells was maintained throughout differentiation, without differentiation delay or lineage bias. Multimodal single-cell sequencing capturing genotype, transcriptomes, and methylomes in HSPCs, was applied to individuals with *DNMT3A* R882-mutated CH and multiple myeloma.⁹⁹ *DNMT3A* mutations resulted in myeloid bias and an expansion of immature myeloid progenitors primed toward a megakaryocytic-erythroid fate, with dysregulated expression of lineage and leukemia stem cell genes. Mutated *DNMT3A* cells displayed preferential hypomethylation of polycomb repressive complex 2 targets and a specific CpG flanking motif. Notably, the hypomethylation motif was enriched in binding motifs of key hematopoietic transcription factors, a potential mechanistic link between *DNMT3A* mutations and aberrant transcription. Single-cell studies also facilitated identification of cooccurring mutations within the same cell. Cells with double mutations of *DNMT3A/TET2* or biallelic *TET2* mutations tended to have a higher variant allele frequency, and these mutations together may confer an enhanced advantage.¹⁰⁰

An inflammatory phenotype is frequently associated with CH, especially with *TET2* mutations: evidence includes skewing to proinflammatory tissue-resident macrophages, and clinical associations of atherosclerotic cardiovascular disease, obstructive pulmonary disease, and gout. Supporting CHIP as a secondary phenomenon are observations of clonal expansion of *DNMT3A*-mutated cells in mouse models of infection and inflammation.¹⁰¹⁻¹⁰⁶ Inflammation might be driven by primary cell-autonomous effects of the CH mutant cells, or preexisting CH mutations may be adaptive and expand secondary to an inflammatory environment. Gene signatures associated with previous exposure to inflammation are upregulated in HSCs from individuals with CH, supporting a role of inflammation in the development of CH.⁹⁸ In addition, wild-type HSCs in *DNMT3A*- and *TET2*-mutated samples showed enhanced expression of inflammatory, quiescence, and chemokine gene signatures, and enhanced cell proliferation, compared with wild-type HSCs in non-CH samples. Similarly, wild-type *TET2* HSCs from CH individuals had aberrant IFN-response signatures compared with wild-type HSCs from healthy controls. In a mouse model, transplantation of heterozygous *Tet2*-hKO cells resulted in an enhancement of IFN-response signatures in recipient wild-type cells.¹⁰⁰ Overall, these observations suggest that the CH clones affect wild-type cells and may alter the BM environment to promote further positive selection of CH clones.

Other BMF syndromes

Marrow failure is a recognized complication of immunotherapy for cancer and, like other autoimmune toxicities (hepatitis and colitis), is assumed to be secondary to off-target immune effects.^{107,108} Cytopenias are frequent after chimeric antigen receptor T-cell (CAR T) infusions: local inflammation, CH, and MDS have been hypothesized as mechanisms (MDS has been diagnosed in ~5% of patients).¹⁰⁹⁻¹¹⁴ scRNA-seq of the BM aspirates from 16 patients with diffuse large B-cell lymphoma treated with axicabtagene ciloleucel, of whom 11 had a grade 3 to 4 cytopenia at day 30,¹¹⁵ revealed GZMH⁺ FGFBP2⁺ CD8⁺ T cells with a cytotoxic signature, and IFN signaling and inflammatory pathways were elevated in multiple immune cells and hematopoietic cells. Compared with CD8⁺ T cells, from patients without toxicity CD8⁺ T cells in patients with CART-associated cytopenia had more clonal expansion but they did not express the CAR transcript. Using scRNA + TCRαβ-seq, we obtained similar results in a diffuse large B-cell lymphoma case treated with tisa-cel¹¹⁶; T cells with oligoclonal expansion and a CD8⁺CD57⁺ phenotype were observed, as in AA and T-LGLL.

In vacuoles, E1 enzyme, X-linked, autoinflammatory, somatic (VEXAS) syndrome, somatic *UBA1* mutations in HSPCs and myeloid cells in the PB cause decreased ubiquitylation, which triggers cellular stress responses that upregulate the unfolded protein response, and activate multiple innate immune pathways.⁴² We, and others, have begun to investigate VEXAS syndrome using integrated analyses of single-cell immunophenotyping, bulk RNA-seq, cytokine profiling, scRNA-seq of peripheral cells and skin in patients with VEXAS syndrome, and overlapping phenotypes (VEXAS syndrome–like autoinflammatory disease, low-risk MDS, and healthy controls).¹¹⁷ Circulating monocytes are quantitatively decreased with features of inflammatory activation and exhaustion. Migration of monocytes to tissues also contributes to monocytopenia: CD16⁺CD163⁺ monocytes and M1 macrophages localize in skin lesions of patients with VEXAS syndrome. Analysis of PB mononuclear cells using scRNA-seq confirmed dysregulated proinflammatory and cell death signatures in VEXAS monocytes. In our study of BMMNCs and HSPCs, there was early activation of inflammatory pathways (in particular TNF-α and both IFN-α and IFN-γ) in the HSC compartment, likely intrinsic to *UBA1*-mutated cells; hematopoiesis markedly biased toward myeloid (particularly granulocytic) differentiation of VEXAS syndrome HSCs; and increased apoptosis of *UBA1*-mutated lymphoid progenitors, all potential mechanisms of clonal dominance of *UBA1*-mutated myeloid cells and for lymphocytopenia.¹¹⁸ Ongoing single-cell multiomic approaches of VEXAS syndrome BM should reveal early events in HSPCs and the cell-autonomous and nonautonomous immune activations of *UBA1*-mutated cells.

Frequent events and molecular pathways involved in BMF syndromes are summarized in [Figure 2](#). Main findings from key studies using single-cell genomics techniques on immune BMF diseases are in [Table 2](#).

Constitutional BMF syndromes

Single-cell methods have been applied to inherited disorders including pure red blood cell aplasia in its congenital form,

Diamond-Blackfan anemia,⁴⁵⁻⁵³ GATA2 deficiency,⁵⁴⁻⁵⁸ deficiency of adenosine deaminase 2 (DADA2),⁵⁹⁻⁶² and telomere biology disorders⁶³ (Table 1). Transcriptomics of single erythroid progenitors in patients with Diamond-Blackfan anemia demonstrated shortened cell cycle in erythroid progenitors, and IFN- α -inhibited cell cycle progression in patients responding to glucocorticoid treatment.¹²⁰ In GATA2 deficiency, HSCs with increased erythroid/megakaryocytic priming contribute to aberrant lymphoid/myeloid differentiation.⁹⁵ By sequencing single monocytes, increased nonclassical monocytes and activation of IFN pathways were implicated in DADA2; previously unsuspected cross talk of monocytes with T cells appeared to drive upregulation of *STAT1* and activation and cytotoxicity of T cells in DADA2.^{121,122} Transcriptome and chromatin accessibility assays of single HSPCs in telomerase-deficient mice and patients with heterozygous pathogenic germ line *TERT* mutations showed that cell-intrinsic upregulation of the innate immune signaling response directly compromised self-renewal in HSCs and led to their exhaustion; targeting the IFI16 signaling axis of a cytosolic DNA sensor overcame IFN activation and skewed differentiation toward the megakaryocytic lineage in telomere-dysfunctional HSCs.¹²³

Conclusions and future directions

For investigators who have learned and used single-cell genomics, the method can appear revolutionary, as remarkable as the invention of the microscope with regard to the quality, quantity, and interrelatedness of the data generated. In acquired AA, cytotoxic lymphocyte destruction of stem cells has been implicated experimentally for decades, but no technique could provide the detailed resolution of scRNA-seq or cytometry by time of flight, with which relatively superficial analysis many unsuspected features of the immune pathophysiology and the status of target cells have been revealed. Like other remarkable inventions, single-cell genomics developed from a simple, if challenging, combination of technologies, that is, single-cell separation and sequencing and the associated algorithms are critical. The vast amount of information generated by single-cell experiments is susceptible to deep mining and reanalysis. As with much in the digital revolution, the “black boxes” containing the equations can be discomfiting, and the computational team generating the data may be strangers to biologic and medical research questions. Mitigating concerns regarding the black box, sequence and code are available for most single-cell sequencing experiments to allow reanalysis,

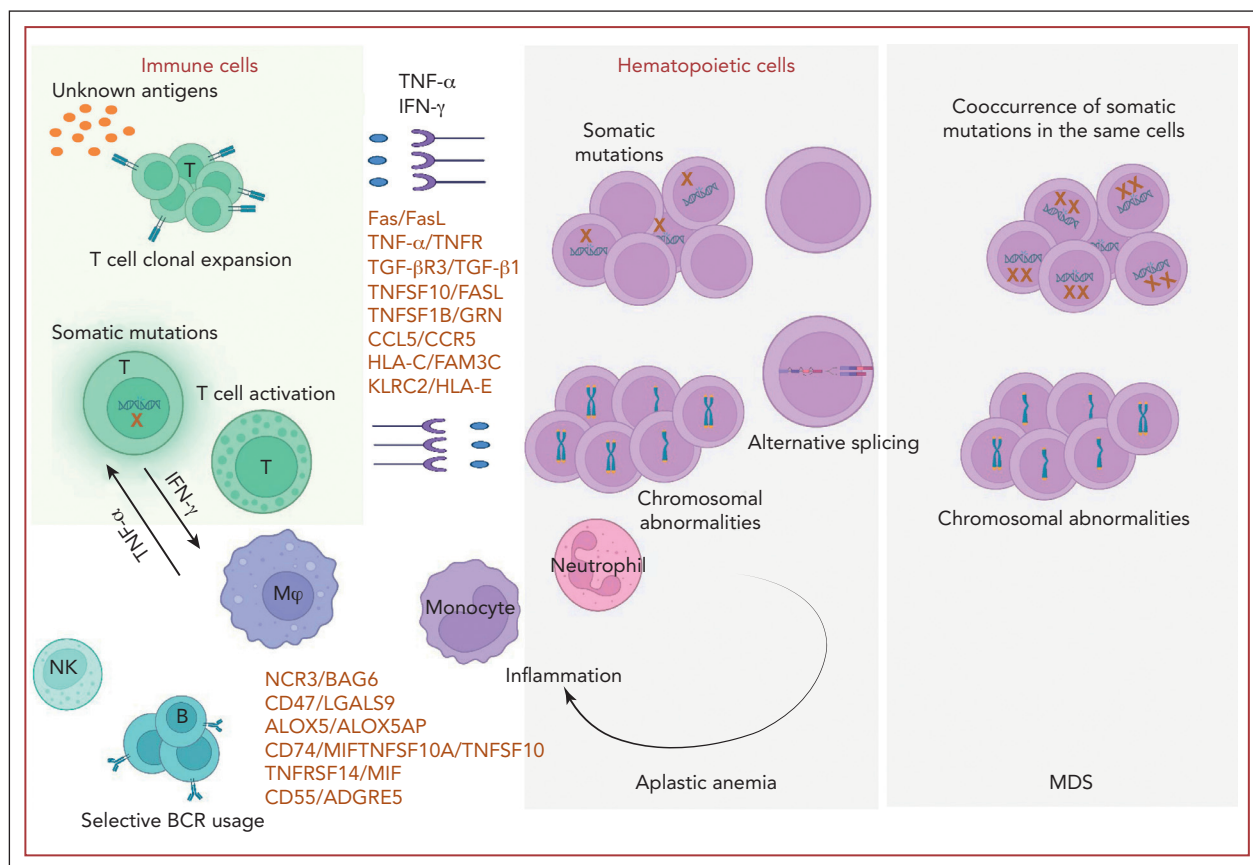


Figure 2. Frequent events and molecular pathways involved in immune BMF syndrome. In immune BMF syndrome, T cells, with or without somatic mutations (eg, on *STAT3*) undergo clonal expansion and activation. This occurs after recognizing unknown antigens, causing the T cells to polarize to type 1 T helper cell response and stimulate cytotoxic T cells. Excessive production of proinflammatory cytokines like IFN- γ and TNF- α and cytotoxic T lymphocytes lead to HSPC destruction via Fas/Fas ligand (FasL) and the TNF- α and receptor apoptosis pathway. Newly identified (by scRNA-seq) ligand–receptor pairs such as TGF- β R3/TGF- β 1, TNFSF10/FasL, and CCL5/CCR5 also contribute to cell–cell interactions in this process. B cells exhibit distinct BCR usage and interact with other cell types through ligand–receptor pairs such as NCR3/BAG6, CD47/LGALS9, and ALOX5/ALOX5AP. NK cells play an immunomodulatory role in AA. Somatic mutations and chromosomal abnormalities are prevalent and participate not only in CH but also contribute to an inflammatory phenotype through cell-autonomous and non–cell-autonomous effects. Alternative splicing is observed in AA and MDS, contributing to lineage bias. Figure created with BioRender.com.

Table 2. Summary of single-cell genomics studies in immune BMF

Disease	Content	Method	Platform	Sample	Patient cohort	Disease pathogenesis	Treatment	Key finding	Reference
AA	T-cell landscape of immune AA	TCR β -seq and scRNA + TCR $\alpha\beta$ -seq	Chromium system, 5' (10x Genomics)	T cells from BM and PB	153 patients with AA (samples at diagnosis, during remission, and at relapse)	Yes	Yes	Private clonotypes in patients with immune AA may recognize a common antigen; AA signature clonotypes were of effector phenotypes and fluctuate after IST.	64
AA	Somatic mutations in lymphocytes in immune AA, and phenotypes of STAT3-mutated clones	scRNA + TCR $\alpha\beta$ -seq	Chromium system, 5' (10x Genomics)	Purified T-cell clones	Serial samples from 2 index patients with SAA	Yes	Yes	Somatic mutations were common in patients with AA, enriched in CD8 ⁺ T cells, and accumulated most on the JAK-STAT and MAPK pathways; a STAT3-mutated clone was cytotoxic and attenuated by successful IST.	65
AA	Immune cell phenotypes in pediatric SAA	Single-cell mass cytometry and scRNA-seq	CytoF and chromium system, 5' (10x Genomics)	BMMNCs	Nine at diagnosis, 3 after IST, and 4 healthy donors	Yes	Yes	Th17-polarized CD4 ⁺ naive T cells with the JAK3/STAT3 pathway activation in pediatric SAA.	66
AA	Multimiomics analysis of AA and a murine model	Publicly available scRNA-seq data (GSE145669) from references, microarray data (GSE3807), and liquid chromatography/mass spectrometry	N/A	Plasma for proteomics; BM-derived HSPCs, CD4 ⁺ and CD8 ⁺ T cells from the BM and PB (scRNA-seq data from reference 28); and sorted CD3 ⁺ T cells (microarray data from GSE3807)	Plasma from 14 patients with SAA and 15 healthy donors	Yes	N/A	Differential proteomics and metabolomics in AA, a population of activated CD8 ⁺ CD38 ⁺ T cells involved in AA.	67
AA	Single-cell transcriptome of hematopoietic cells and T cells	Full-length scRNA-seq	STRT-seq and full-length Smart-seq2	BM-derived HSPCs and CD4 ⁺ and CD8 ⁺ T cells from the BM and PB	Fifteen patients with treatment-naïve AA, including 12 with non-SAA, 3 with SAA, and 4 healthy donors; 5 patients with non-SAA responsive to cyclosporine A plus androgens treatment	Yes	Yes	Selective lineage disruption, alternative splicing, and polyadenylation in AA; cell type-specific ligand-receptor interactions.	68
AA	NK cell phenotypes in SAA	scRNA-seq	Chromium system, 3' (10x Genomics)	Sorted NK cells from the BM and PB	Three patients with treatment-naïve SAA	Yes	N/A	NK cell subsets altered in SAA.	70
AA	Single-cell transcriptome of BM cells	scRNA-seq	Chromium system, 3' (10x Genomics)	BMMNCs and enriched CD34 ⁺ cells	Two patients with SAA and 2 healthy donors	Yes	N/A	Dysregulated gene expression of hematopoietic cells, and altered BCR usage and interactions with other cell types.	77

AA, aplastic anemia; axi-cel, axicabtagene ciloleucel; BCR, B-cell receptor; CITE-seq, cellular indexing of transcriptomes and epitopes by sequencing; CMP, common myeloid progenitor; CyTOF, cytometry by time of flight; DLBCL, diffuse large B-cell lymphoma; FAC, fluorescence-activated cell; GMP, granulocytic-monocytic progenitor; HMA, hypomethylating agents; IST, immunosuppressive therapy; lncRNA, long noncoding RNA; Lin⁻, lineage negative; PBMCs, PB mononuclear cells; PNH, paroxysmal nocturnal hemoglobinuria; SAA, severe aplastic anemia; STRT-seq, single-cell tagged reverse transcription sequencing; T-LGLL, T-cell large granular lymphocyte leukemia; WT, wild type.

Table 2 (continued)

Disease	Content	Method	Platform	Sample	Patient cohort	Disease pathogenesis	Treatment	Key finding	Reference
MDS and CH	Impact of splicing aberrations in human hematopoiesis	Single-cell multiomics: surface protein, gene expression, and RNA splicing	GoT-Splice	CD34 ⁺ cells	Six patients with MDS and 2 with CH	Yes	N/A	<i>SF3B1</i> mutations altered 3' splicing site usage and lineage output in MDS and CH.	85
MDS	Hematopoietic differentiation and monosomy 7 cells in MDS	scRNA-seq	C1 Fluidigm	Lin ⁻ CD34 ⁺ CD38 ⁺ and Lin ⁻ CD34 ⁺ CD38 ⁻ cells	Five patients with MDS (3 evolved from AA) and 4 healthy donors	Yes	Yes	Distinct differentiation patterns of patients with MDS, and differential gene programs in monosomy 7 cells compared with diploid cells.	93
MDS	lncRNA landscape in human HSPCs	scRNA-seq	C1 Fluidigm	Lin ⁻ CD34 ⁺ CD38 ⁺ and Lin ⁻ CD34 ⁺ CD38 ⁻ cells	Five patients with MDS (3 evolved from AA) and 4 healthy donors	Yes	Yes	lncRNAs in HSPCs were stage- and cell-type specific, and closely correlated with protein-coding genes in the regulation of hematopoiesis and cell fate decisions; there was differential lncRNA expression in MDS and aneuploid cells.	94
MDS	HSPCs	scRNA-seq	Chromium system, 3' (10x Genomics)	Lin ⁻ cells from the BM	Five patients with MDS, 2 with secondary AML, and 17 healthy donors (from GSE120221)	Yes	N/A	Abnormal proliferation, RNA metabolism, and ribosome biogenesis in MDS stem cells.	80
MDS	Stem cell architecture and association with disease progression and response to therapy in MDS	scRNA-seq	Chromium system, 3' (10x Genomics)	Lin ⁻ CD34 ⁺ HSPCs	One patient with MDS with a GMP pattern and 1 patient with MDS with a CMP pattern	Yes	Yes	scRNA-seq to validate the distinct differentiation pattern in patients with MDS, and this stem cell architecture was associated with disease progression and response to therapy.	81
MDS	Frequency and basis for coexistence of splicing factor mutations	scDNA-seq	Mission Bio	BMMNCs	Eleven patients with myeloid neoplasm and double splicing factor mutations	Yes	N/A	Escape from epistasis of RNA splicing factor mutations occurred with specific mutation alleles and preservation of 1 wild-type allele.	86
MDS	Somatic mutations and copy number variations during disease progression and treatment resistance	scDNA-seq	Tapestri Single-cell DNA AML Panel Kit	BM samples	Serial samples of 2 patients with MDS treated with HMA	Yes	Yes	Disease progression and resistance to HMA was accompanied by changes in clone heterogeneity of pathogenic mutations and acquisition of copy number variations.	87

AA, aplastic anemia; axi-cel, axicabtagene ciloleucel; BCR, B-cell receptor; CITE-seq, cellular indexing of transcriptomes and epitopes by sequencing; CMP, common myeloid progenitor; CyTOF, cytometry by time of flight; DLBCL, diffuse large B-cell lymphoma; FAC, fluorescence-activated cell; GMP, granulocyte-monocytic progenitor; HMA, hypomethylating agents; IST, immunosuppressive therapy; lncRNA, long noncoding RNA; Lin⁻, lineage negative; PBMCs, PB mononuclear cells; PNH, paroxysmal nocturnal hemoglobinuria; SAA, severe aplastic anemia; STRT-seq, single-cell tagged reverse transcription sequencing; T-LGLL, T-cell large granular lymphocyte leukemia; WT, wild type.

Table 2 (continued)

Disease	Content	Method	Platform	Sample	Patient cohort	Disease pathogenesis	Treatment	Key finding	Reference
T-LGLL	T-cell clonotypes and phenotypes in T-LGLL	scRNA + TCR $\alpha\beta$ -seq	Chromium system, 5' (10x Genomics)	Enriched CD45 ⁺ cells from PBMCs	Nine patients with T-LGLL and 6 healthy controls	Yes	N/A	T-LGLL clonotypes were more cytotoxic and exhausted than healthy reactive clonotypes; nonleukemic T cell repertoire was also more mature, cytotoxic, and clonally restricted than in other cancers and autoimmune disorders; and leukemic T-LGLL clonotypes shared TCR similarities with their nonleukemic repertoires.	96
T-LGLL	T-cell clonotypes and phenotypes in T-LGLL and with treatment	scRNA + TCR $\alpha\beta$ -seq	Chromium system, 5' (10x Genomics)	Enriched CD3 ⁺ T cells from PBMCs	Thirteen patients with T-LGLL (12 had paired samples before and 3 or 6 mo after alemtuzumab treatment) and 6 healthy controls	Yes	Yes	There was a lack of common clonotypes of TCR usage in T-LGLL; dysregulated cell survival programs featured with downregulation of apoptosis genes were prominent in T-LGLL cells; apoptosis genes were upregulated after alemtuzumab treatment, more in responders than in nonresponders; and TCR diversity was further skewed after treatment.	97
CH	Impact of <i>DNMT3A</i> and <i>TET2</i> mutations on hematopoietic differentiation	Multiomic single-cell analysis: index sorting, scRNA-seq, and genotyping	Target-seq+	BM samples	Nine CH samples with predicted loss-of-function mutations	Yes	N/A	<i>DNMT3A</i> -mutant and <i>TET2</i> -mutant clones expand in a different manner; and there was a non-cell autonomous impact on WT HSCs in CH.	98
CH	<i>DNMT3A</i> R882 mutations on hematopoiesis	Multiomic single-cell analysis: capturing genotype, transcriptomes, and methylomes	GoT	CD34 ⁺ HSPCs	Three patients with multiple myeloma and <i>DNMT3A</i> R882 mutations	Yes	N/A	<i>DNMT3A</i> R882 mutations perturbed early progenitor states through selective hypomethylation.	99
CH	Pathogenesis of CH	Simultaneous detection of gene mutations and expression on single cells	Fluidigm C1-HT system	BM-derived HSPCs	Sixteen patients with CH and 16 healthy controls	Yes	N/A	There were non-cell-autonomous phenotypes or an altered BM environment that favored the positive selection of CH ⁻ clones.	100
BMF	Cellular and molecular features associated with CAR T-associated prolonged cytopenia	scRNA + TCR $\alpha\beta$ -seq	Chromium system, 5' (10x Genomics)	BM samples	Sixteen patients with DLBCL who had prolonged cytopenia after treatment with axi-cel	Yes	Yes	Clonally expanded IFN- γ -expressing cytotoxic T cells and an enrichment of IFN signaling within the HSCs of BM aspirates may be responsible for CAR T cell-associated cytopenia.	115
BMF	Oligoclonal T-cell expansion	CITE-seq, scRNA +TCR $\alpha\beta$ -seq	Chromium system, 5' (10x Genomics)	A patient with BMF after CD19 CAR T-cell therapy for Richter-transformed DLBCL	PBMCs before and after CAR T-cell therapy	Yes	Yes	Oligoclonal T-cell expansion in this patient with BMF after CD19 CAR T-cell therapy.	116

AA, aplastic anemia; axi-cel, axicabtagene ciloleucel; BCR, B-cell receptor; CITE-seq, cellular indexing of transcriptomes and epitopes by sequencing; CMP, common myeloid progenitor; CyTOF, cytometry by time of flight; DLBCL, diffuse large B-cell lymphoma; FAC, fluorescence-activated cell; GMP, granulocytic-monocytic progenitor; HMA, hypomethylating agents; IST, immunosuppressive therapy; lncRNA, long noncoding RNA; Lin⁻, lineage negative; PBMCs, PB mononuclear cells; PNH, paroxysmal nocturnal hemoglobinuria; SAA, severe aplastic anemia; STRT-seq, single-cell tagged reverse transcription sequencing; T-LGLL, T-cell large granular lymphocyte leukemia; WT, wild type.

Table 2 (continued)

Disease	Content	Method	Platform	Sample	Patient cohort	Disease pathogenesis	Treatment	Key finding	Reference
VEXAS	Inflammasome pathway activation and monocyte dysregulation in VEXAS syndrome	scRNA-seq	Chromium system, 3' (10x Genomics)	PBMCs	Two patients with VEXAS syndrome, 2 patients with VEXAS syndrome-like disease (severe autoinflammatory disease without UBA1 mutations), 2 patients with MDS, and 2 healthy controls	Yes	N/A	scRNA-seq of PBMCs with dysregulated proinflammatory and cell death signatures in monocytes.	117
VEXAS	Inflammation and UBA1 mutations in early hematopoiesis in VEXAS.	scRNA + TCR/BCR β -seq	Chromium system, 3' and 5' (10x Genomics)	BMMNCs and Lin ⁻ CD34 ⁺ HSPCs	Nine patients with VEXAS syndrome and 4 healthy controls	Yes	N/A	Myeloid lineage bias and inflammatory pathway activation occurred early in hematopoietic stem cells in VEXAS, and appeared intrinsic to UBA1 mutant cells.	118
PNH	Hematopoietic cell phenotypes	scRNA-seq	Chromium system, 3' (10x Genomics)	FAC-sorted CD59 ⁺ and CD59 ⁻ BMMNCs	Three patients and 4 healthy donors	Yes	N/A	Different proportion of hematopoietic cells in PNH BM.	119

AA, aplastic anemia; axi-cell, aixcabtagene ciltacelucel; BCR, B-cell receptor; CITE-seq, cellular indexing of transcriptomes and epitopes by sequencing; CMP, common myeloid progenitor; CyTOF, cytometry by time of flight; DLBCL, diffuse large B-cell lymphoma; FAC, fluorescence-activated cell sorting; GMPC, granulocyte-monocytic progenitor; HMA, hypomethylating agents; IST, immunosuppressive therapy; lncRNA, long noncoding RNA; Lin⁻, lineage negative; PBMCs, peripheral blood mononuclear cells; PNH, paroxysmal nocturnal hemoglobinuria; SAA, severe aplastic anemia; STRT-seq, single-cell tagged reverse transcription sequencing; T-LGLL, T-cell large granular lymphocyte leukemia; WT, wild type.

reinterpretation, and interlaboratory comparisons and reconciliations.

Single-cell data are different quantitatively and qualitatively from the historical results acquired in hematology laboratories to address blood diseases: experiments based on cell culture and phenotyping, cell biology, biochemistry, and molecular biology. Compared with conventional experiments, the amount of data from a single scRNA-seq run is orders of magnitude greater: hundreds to thousands of individual cells, hundreds to thousands of transcripts from thousands of individual genes as the initial data set, which is then subject to digital quality control and deep analysis of mRNA length, splicing, and concomitant mutations detectable in complementary DNA or mRNA and now also simultaneous proteomics and epigenetics of individual cells. Analysis of raw data involves filtering, accounting for missing data, mathematical and statistical adjustments, and a wide variety of algorithms to assess ligands and their receptors and other cell-cell relationships, much of which is novel to the biologically oriented experimentalists. As with any powerful new technology, the method itself can impel novel approaches to biology that would not be suggested in conventional experiments.

Methods of validation of scRNA-seq are not well established, universally accepted, or necessarily rational; for example, quantitative gene amplification and measures of alternatively spliced transcript sizes almost always replicate sequence data. "Orthogonal" studies, poorly defined in theory but commonly requested by reviewers and editors, may be of an uncertain value because of the biologic complexity of transcription regulation, and RNA processing, protein translation, transport, and degradation. Whether results based on isolated and manipulated cells in strikingly unphysiologic conditions under artificial laboratory conditions should be privileged as "gold standards", should retain interpretive value, or could be predicated to capture the complex interactions of single-cell genomics, is arguable. The sheer number of such hypothetical experiments that might follow on a scRNA-seq result is so large as to be impractical, nor is it obvious how such correlative studies should be assessed statistically to validate a sequencing experiment. Finally, single-cell genomics is sufficiently novel that, in the absence of simple and universally applied platforms, pipelines of data processing, and analytical methods, comparison of results among laboratories remains problematic. Exactly how single-cell genomics, as well as associated proteomics and immunogenic studies, will be integrated into historical data and routine research laboratory approaches is unclear. Nonetheless, the amount, depth, and dimension of data generated by single-cell methods cannot be replicated or replaced by other methods.

Over time, single-cell genomics have evolved from a monolayer of data of gene expression or mutation to integration with protein markers and, ultimately, combined for examination of transcript splicing, DNA methylation, and other epigenetic modifications. Combined with advanced and improving bioinformatics, single-cell genomics can be applied to nearly every aspect of hematopoiesis: cell identity and abundance, differentiation potential and trajectories, chromosomal abnormalities, gene mutations, gene splicing, and epigenetic alterations, all with or without disease or perturbations. Due to high cost and scarcity of samples, current single-cell studies in BMF diseases

have focused on elucidating disease pathogenesis in small patient cohorts, characterizing disease features, and only a few have explored treatment mechanisms and effects. Future studies on larger patient numbers in diseases with overlapping manifestations, and on longitudinal samples before and after treatment should facilitate identification of biomarkers for diagnosis, differential diagnosis, and predictors of response to treatment. We anticipate the appearance of single-cell studies of many human diseases; most immediately, single-lineage BMF syndromes and immune cell compositions in MDS, as well as mechanistic studies in animal models and with in vitro perturbations with growth factors, cytokines, and specific cell populations. Comparison and collation of these large, but also enormously rich, data sets are the challenges for the future.

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Footnote

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