Genetic and evolutionary patterns of treatment resistance in relapsed B-cell lymphoma

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**Key Points**

- **KMT2D** and **TP53** are predominantly mutated in rrDLBCL and remain clonally stable following therapy.
- **MS4A1** mutations are commonly acquired and undergo clonal expansion following treatment with rituximab-containing therapy.

Diffuse large B-cell lymphoma (DLBCL) patients are typically treated with immunochemotherapy containing rituximab (rituximab, cyclophosphamide, hydroxydaunorubicin-vincristine [oncovin], and prednisone [R-CHOP]); however, prognosis is extremely poor if R-CHOP fails. To identify genetic mechanisms contributing to primary or acquired R-CHOP resistance, we performed target-panel sequencing of 135 relapsed/refractory DLBCLs (rrDLBCLs), primarily comprising circulating tumor DNA from patients on clinical trials. Comparison with a metacohort of 1670 diagnostic DLBCLs identified 6 genes significantly enriched for mutations upon relapse. **TP53** and **KMT2D** were mutated in the majority of rrDLBCLs, and these mutations remained clonally persistent throughout treatment in paired diagnostic-relapse samples, suggesting a role in primary treatment resistance. Nonsense and missense mutations affecting **MS4A1**, which encodes CD20, are exceedingly rare in diagnostic samples but show recurrent patterns of clonal expansion following rituximab-based therapy. **MS4A1** missense mutations within the transmembrane domains lead to loss of CD20 in vitro, and patient tumors harboring these mutations lacked CD20 protein expression. In a time series from a patient treated with multiple rounds of therapy, tumor heterogeneity and minor **MS4A1**-harboring subclones contributed to rapid disease recurrence, with **MS4A1** mutations as founding events for these subclones. **TP53** and **KMT2D** mutation status, in combination with other prognostic factors, may be used to identify high-risk patients prior to R-CHOP for posttreatment monitoring. Using liquid biopsies, we show the potential to identify tumors with loss of CD20 surface expression stemming from **MS4A1** mutations. Implementation of noninvasive assays to detect such features of acquired treatment resistance may allow timely transition to more effective treatment regimens.

**Introduction**

Diffuse large B-cell lymphoma (DLBCL) is the most common type of non-Hodgkin lymphoma, representing 30% to 40% of cases diagnosed in North America. DLBCL can arise de novo or through histologic transformation. Published rrDLBCL exome cases can be obtained from the EGA as described in the appropriate publication. The full-text version of this article contains a data supplement. © 2020 by The American Society of Hematology.
transformation from indolent lymphoid malignancies, most commonly transformed follicular lymphoma (tFL). Patients diagnosed with DLBCL are generally treated with a standard immunochemotherapy regimen comprising 4 chemotherapeutic agents and the anti-CD20 monoclonal antibody (mAb) rituximab (rituximab, cyclophosphamide, hydroxydaunorubicin, vincristine [oncovin], and prednisone [R-CHOP]), which is curative for 60% to 70% of DLBCL cases. 3,4 However, for patients with DLBCL that is refractory to frontline treatment and those who experience subsequent relapse (relapsed/refractory DLBCL or rrDLBCL), outcomes are extremely poor, with a 2-year overall survival of 20% to 40%.3,4 Although numerous treatments are under investigation to improve both frontline and salvage therapy, the success of these new therapies has been limited. The advancement of therapeutics in the relapse setting has likely been encumbered by our limited understanding of the molecular features that underlie resistance to R-CHOP. Identifying such mechanisms may reveal additional treatment options and lead to biomarkers allowing patients to be paired with appropriate treatments.

Whereas the genomic landscape of diagnostic DLBCL is well understood, the genomic features of both rrDLBCL and DLBCLs that arise through histologic transformation remain elusive due to the difficulties in obtaining tumor tissue from relapsed patients. Early studies exploring the genetics of rrDLBCL identified several candidate genes enriched for mutations among rrDLBCL cases, including TP53, STAT6, FOXO1, SOCS1, and PIM1. 5-7 Indeed, mutations in some of these are predictive at diagnosis (eg, FOXO1 8 and TP53 9,10), whereas others may reflect a more diverse representation of DLBCLs beyond those arising de novo, including tFLs. Previous studies of rrDLBCL have been limited by small sample sizes, with the largest single cohort comprising 47 cases.11 In addition to comparing mutation prevalence between untreated DLBCL and rrDLBCL, some studies compared the clonal population structure and mutation burden between paired diagnostic and relapse samples.11,12 Such analyses identified additional candidate genes whose mutation could contribute to treatment resistance, such as BCL2 and CREBBP,11 but these results have not been independently confirmed. The genetic heterogeneity of rrDLBCL warrants a comprehensive study of rrDLBCL to definitively identify genes whose mutation may afford resistance to components of R-CHOP.

Although cell-free DNA is commonly used for noninvasive quantitative monitoring of disease burden,13-15 with sufficient levels of circulating tumor DNA (ctDNA), liquid biopsies can also provide a source of tumor genetic material allowing broad genetic characterization of tumors.16-18 In DLBCL, mutations found within ctDNA reflect somatic mutations irrespective of anatomical biases, providing opportunity for comprehensive exploration of tumor genetics and heterogeneity.19 This can be accomplished using a single time point 20 but is more powerful when applied to serial samples as the variant allele frequency can reveal clonal dynamics and thus putative resistance mechanisms.21

To more thoroughly survey the genetic mechanisms of R-CHOP resistance in rrDLBCL, we explored the genetics of rrDLBCL in 135 cases relying on a combination of tumor tissue and plasma-derived ctDNA collected after relapse. By comparing the mutational profiles of these cases to a large cohort of untreated DLBCLs, we identified 6 genes significantly enriched for mutations. Many of these genes are commonly mutated in untreated DLBCL, notably KMT2D and TP53, and remain clonally stable over the course of therapy. Another of these genes, MS4A1, encodes the B-cell surface marker CD20 and is the target of rituximab. MS4A1 missense mutations are restricted to transmembrane domains and inhibit binding of both rituximab and other anti-CD20 antibodies. These finding have the potential to identify patients at a high risk of R-CHOP failure prior to frontline treatment and those with tumors likely to be resistant to rituximab-based secondary therapies and other CD20-targeted immunotherapies.

Methods

Targeted sequencing and mutational analysis of rrDLBCLs

This study included samples from 135 patients with rrDLBCL with 117 of these comprising plasma collected within 3 clinical trials or the general patient population treated in Quebec (supplemental Table 1). This study was reviewed and approved by the Research Ethics Boards of the University of British Columbia-BC Cancer and the Jewish General Hospital (18-030), in accordance with the Declaration of Helsinki. Plasmas were collected and processed as previously described18,22 and detailed in the supplemental Methods. The remaining 18 cases represent tissue biopsies previously described by our group (supplemental Table 2).6 With the exception of these 18 cases with existing exome data, all samples were subjected to library construction using custom adaptors with unique molecule identifiers. Libraries were enriched by hybridization-capture using a custom set of LockDown oligonucleotides targeting the exons of 63 genes (supplemental Table 3). The genes on this panel represent well-established DLBCL genes from previous publications and included MS4A1 based on preliminary exome and genome data from PT255 and the 18 rrDLBCL exomes. Following enrichment, all libraries were multiplexed and sequenced using Illumina chemistry using 125- or 150-bp paired reads on either MiSeq or HiSeq2500 instruments. After alignment, reads were collapsed into consensus sequences using in-house pipeline that leverages unique molecule identifier information. Single nucleotide variants and small insertions and deletions (henceforth simple somatic mutations) were identified with Strelka23 with custom postfiltration steps to remove artifacts (supplemental Methods; supplemental Table 4).

Metaanalysis of untreated DLBCLs

To obtain a cohort representative of diagnostic DLBCLs, we compiled exome data from 3 previously published cohorts24-26 and a cohort of paired tumor/normal genomes,27 amounting to 1670 cases termed the “untreated” cohort, because all biopsies were obtained prior to treatment. As matched constitutional samples were not available for the majority of these exome cases, and because the supplied variant calls were generated using diverse pipelines, we reprocessed all exomes through a standardized variant calling workflow for unpaired tumor samples, including filtering of common and rare germline variants (supplemental Methods; supplemental Figure 1).

Identifying genes associated with rrDLBCL

We identified mutations and hotspots associated with rrDLBCL using 2 complementary approaches. First, we compared the gene and hotspot mutation frequency between rrDLBCL and untreated DLBCL to identify genes enriched for mutations in rrDLBCL.
Mutation hotspots considered here are listed in supplemental Table 5. The mutation frequency of all genes in our panel was compared between the rrDLBCL cohort and the untreated DLBCL cohort, as well as an additional diagnostic cohort, using Fisher’s exact test and Benjamini and Hochberg false discovery rate threshold of <0.1 (supplemental Table 6; supplemental Table 7). Second, leveraging the paired samples representing time points prior to and following treatment (supplemental Table 8), we compared the tumor genomic landscape between time points to identify genes that recurrently showed evidence of clonal selection. Mutations were classified based on the log ratio of the cancer cell fraction (CCF) between the 2 time points, where log-fold change (T2 CCF)/(T1 CCF) > 1.0 indicates a mutation underwent clonal expansion following treatment, log-fold change < −1.0 indicated the mutation was depleted following treatment, with all other values considered stable. We also explored the prevalence of different genetic subgroups using the LymphGen classifier (supplemental Methods; supplemental Tables 2 and 9).29

Evaluation of MS4A1 protein expression and antibody reactivity

Suspension-adapted Chinese hamster ovary (CHO-S) cells (Life Technologies) were cultured in FreestyleCHO media supplemented with 8 mM glutamine (Gibco). Cells were maintained between 0.3 and 1.5 × 10^6 cells/mL in a humidified shaking incubator at 37°C in 8% CO2. CHO-S cells (10^7) were transfected with 10 µg of plasmid DNA containing MS4A1 wild-type (WT) or mutant constructs. Details of mutagenesis are included in supplemental Methods and supplemental Table 10. For each transfection, efficiency was determined using a positive control (green fluorescent protein [GFP]) to demonstrate that cells were permissive for transfections. For all experiments, WT CD20 transfections were performed in parallel with mutants. Transfected cells (1.5 × 10^6) were opsonized with 1.5 µg of unlabeled anti-CD20 antibody for 30 minutes at 4°C. Unbound antibody was washed twice in 2 mL wash buffer (phosphate-buffered saline containing 1% bovine serum albumin and 10 mM sodium azide) and centrifuged at 400g for 5 minutes and resuspended in ~150 µL of wash buffer. Primary antibody was detected with 0.2 µg/mL of anti-human immunoglobulin G (lgG)–phycoerythrin or anti-mouse lgG-phycoerythrin polyclonal antibodies (Stratech) and stained for 30 minutes at 4°C. Cells were washed in 2 mL of wash buffer before acquiring on a FACSCalibur fluorescence-activated cell sorter. Flow cytometry data were analyzed in FCExpress v.3 (De Novo software, Pasadena, CA), rituximab (human [h]lgG1), ofatumumab (hlgG1), tositumomab (B1, murine [m]lgG1), and obinutuzumab (non-glycomodified hlgG1 type II relative of obinutuzumab) or an isotype control (mlgG1 or hlgG1) were used to stain the cells. Immunoblotting was performed largely as reported previously. In brief, 5 × 10^6 cells were lysed in radioimmunoprecipitation assay buffer with 20 µg separated on a 10% Bis-Tris gel. CD20 expression was assessed using rabbit anti-CD20 clone EP459Y (Abcam) alongside an HRP-conjugated anti-rabbit secondary antibody (NA9340, Sigma) detected using a ChemiDoc-It Imaging System. Full details of immunoblotting are included in supplemental Methods.

PT255 exome sequencing and single-cell analysis

We performed exome sequencing on a single relapsed case (PT255) representing 3 time points: (1) the diagnostic biopsy (diagnosis, D); (2) cell-free DNA (cfDNA) collected following second relapse (relapse 2, R2/P1); and (3) cfDNA collected following third relapse (relapse 3, R3/P5). Somatic variants, copy number alterations, and clonal population structure were analyzed as described above. Somatic coding variants were chosen from this bulk tumor and plasma exome sequencing to represent different clones at varying time points (supplemental Table 11). The Fluidigm Access Array was used for multiplexing amplicon sequencing of selected variants in PT255 plasma samples and circulating tumor single cells from selected time points following relapse (supplemental Table 12).

Results

Enrichment of mutations in rrDLBCL

The pattern of mutations observed in rrDLBCL largely resembles that of untreated DLBCL (Figure 1). As this survey was focused on the genetic landscape following relapse, we searched for genes enriched for mutations after treatment failure. Such mutations are expected to represent either features of primary treatment resistance or examples of mutations subjected to clonal expansion under the selective pressures exerted by therapy. This analysis revealed 6 genes enriched for mutations: KMT2D, TP53, CREBBP, FOXO1, NFKBIE, and MS4A1, with another 2 genes depleted for mutations in rrDLBCL (Figure 2).

The lysine methyltransferase KMT2D is a tumor suppressor in DLBCL and follicular lymphoma (FL) and was mutated in half of all rrDLBCLs (Figure 2A). In addition to a significant increase in KMT2D mutations in rrDLBCL relative to untreated DLBCL (q = 0.0678; OR, 1.68), loss-of-function mutations were even more strongly enriched at relapse (55/135 rrDLBCLs [40.7%] vs 304/1314 untreated [23.1%, q = 1.7 × 10^-5]). Similar to the pattern in untreated cases, truncating mutations were observed across the length of the protein (Figure 3A) and tend to occur before the N-terminal SET domain, which catalyzes H3K4 methylation.

The majority (51%) of rrDLBCLs harbored a TP53 mutation (q = 2.25 × 10^-11; OR, 3.99). In contrast to KMT2D, mutations were predominately missense and affected the DNA-binding L1-sheet helix domain (Figure 3B). We observed recurrent mutations affecting known TP53 hotspots, including Arg175, Arg248, and Arg273, which either bind directly to DNA or coordinate DNA binding. The Arg248 residue, which directly binds to the minor groove of DNA, was the only hotspot significantly enriched for mutations in rrDLBCL (q = 0.0807; OR, 3.29). In our untreated cohort, mutations in TP53 and KMT2D were associated with inferior progression-free survival and overall survival (supplemental Figure 2), with KMT2D truncating mutations associated with inferior progression-free survival (supplemental Figure 3). This survival correlate was independent of other known prognostic factors, including the International Prognostic Index (IPI) and cell-of-origin (COO) in a multivariate setting (supplemental Figure 4; supplemental Table 12).

The rrDLBCLs were also enriched for mutations affecting each of CREBBP (q = 0.0807; OR, 1.74), NFKBIE (q = 0.0232; OR, 2.78), and FOXO1 (q = 0.087; OR, 2.33). The majority of CREBBP missense mutations affected the acetyltransferase domain (28/48 mutations, 58%) (Figure 3C), with the remainder predominantly causing truncation. Mutations in FOXO1 could broadly be defined into 2 classes: those that disrupt the forkhead DNA-binding domain
and those that disrupt FOXO1 phosphorylation (Figure 3D). The latter include mutations-targeted Tyr24, adjacent residues, or the canonical start codon, which both affect the regulation of FOXO1 nuclear localization. 8 We also observed recurrent frameshift deletions affecting Tyr254 in NFKBIE, a negative regulator of NF-κB signaling (Figure 3E). Although mutations in NFKBIE were significantly enriched in rrDLBCL, the prevalence of mutations affecting the Tyr254 hotspot was not significantly higher in this cohort.

MS4A1 exhibited the strongest enrichment for mutations in rrDLBCL (q = 0.023; OR, 4.32). MS4A1 encodes CD20, the B-lymphocyte antigen and target of rituximab and several other therapeutic mAbs. Although truncating mutations were observed across the length of MS4A1, a striking number of missense mutations were also observed (Figure 3F). None of these are predicted to directly affect residues comprising the rituximab epitope nor the epitopes of other mAbs. Instead, the recurrent missense variants were predicted to affect the transmembrane domains of the small loop, including 3 examples of a Tyr86 mutation (2 Tyr86Cys, 1 Tyr86His). Outside of rrDLBCL, mutations affecting this residue appear to be exceedingly rare as they were absent from the entire untreated DLBCL cohort and only appear in a single tumor in COSMIC.33

Recurrent clonal selection following rituximab-based therapy

To further explore genetic mechanisms that contribute to treatment resistance, we inferred the clonal structure and dynamics in the 57 patients with serially collected samples representing time points prior to and following rituximab-containing treatment regimens, including de novo DLBCL, IFL, and other B-cell lymphomas. For each set of samples, we inferred the CCF of each mutation detected in pretreatment tumor tissue biopsies and posttreatment plasma samples. We then compared individual CCFs between...
paired samples and categorized mutations as enriched (clonal expansion), depleted (clonal regression), or stable at relapse within that tumor (Figure 4A). Figure 4B-I shows representative time series for mutations of interest. Overall, coding mutations affecting TP53 (Figure 4B,D-I) and KMT2D (Figure 4D,F-G,I) tended to be stable following therapy, including all examples of TP53 Arg248 mutations and KMT2D loss-of-function mutations (Figure 4D,F,I). We observed numerous examples showing clonal expansion of 1 KMT2D mutation and clonal depletion of a separate KMT2D mutation, suggesting a persistent selective advantage for KMT2D loss (Figure 4G).

Mutations affecting CREBBP and NFKBIE, including NFKBIE Tyr254, were similarly stable prior to and following treatment in most patients. Taken together, mutations in these genes appear to generally represent a component of the founding clone.

In contrast to these genes, MS4A1 mutations exhibited a consistent trend toward clonal expansion in patients following rituximab-containing therapy (Figure 4B-E). This includes several cases inferred to harbor multiple subclonal populations with distinct MS4A1 mutations, with each exhibiting clonal expansion (Figure 4D). MS4A1 mutations were consistently undetectable in diagnostic tissue and appear to result from consistent positive selection under the pressure of R-CHOP and other therapies. This trend along with their predominance in rrDLBCL relative to untreated DLBCLs indicates a role of these mutations in contributing to acquired treatment resistance during exposure to rituximab-containing therapy.

Mutations in MS4A1 attenuate rituximab binding

We next explored the functional effects of MS4A1 mutations and their potential role in promoting rituximab resistance. We transfected a CD20− cell line with WT or mutant CD20 constructs representing common MS4A1 missense mutations observed in patients (Figure 5A). We showed that all 3 MS4A1 mutants had significantly decreased binding of rituximab or other anti-CD20

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**Figure 2. Differentially mutated genes between rrDLBCL and untreated DLBCL.** (A) Mutation type and frequency of each differentially mutated gene in the untreated and rrDLBCL cohorts, using a significance threshold of 0.1 following false discovery rate correction. Untreated cases with insufficient coverage (not callable) in the gene of interest were not counted in the denominator for that gene (supplemental Methods). (B) Forest plot showing the odds ratio for all differentially mutated genes, as determined by the Fisher’s exact test, for all differentially mutated genes (supplemental Table 6). CI, confidence interval.
antibodies, including tositumomab (B1), ofatumumab, and obinutuzumab derivatives by flow cytometry, with 2 mutants (Y86C and L66R) showing a complete absence of binding (Figure 5B; supplemental Figure 5). Consistent with the other mutation tested, cells with ectopic expression of Tyr86Cys were not recognized by any of the anti-CD20 antibodies. In contrast, cells expressing Tyr86His were recognized by all 4 antibodies, albeit at a significantly reduced amount. Because this assay requires expression on the plasma membrane, we next explored whether the mutations affected the expression of CD20 within the cell using immunoblotting with a CD20 antibody that binds within the cytoplasmic domain. Consistent with the result from flow cytometry, an immunoblot of cell lysates showed reduced CD20 protein with the Y86H mutant and no visible expression with the other 2 mutants (Figure 5C). Consistent with the other mutation tested, cells with ectopic expression of Tyr86Cys were not recognized by any of the anti-CD20 antibodies. In contrast, cells expressing Tyr86His were recognized by all 4 antibodies, albeit at a significantly reduced amount. Because this assay requires expression on the plasma membrane, we next explored whether the mutations affected the expression of CD20 within the cell using immunoblotting with a CD20 antibody that binds within the cytoplasmic domain. Consistent with the result from flow cytometry, an immunoblot of cell lysates showed reduced CD20 protein with the Y86H mutant and no visible expression with the other 2 mutants (Figure 5C).

MS4A1-harboring subclones drive rapid treatment resistance

To further explore how multiple rounds of therapy can influence clonal structure in a MS4A1-mutant patient (PT255), we followed the progression of a patient with chemorefractory aggressive high-grade B-cell lymphoma using multiple complementary approaches (Figure 4B). We initially performed exome sequencing on 3 time points beginning with the untreated diagnostic tumor biopsy (diagnosis, D), followed by cfDNA collected after failure of both R-CHOP and subsequent high-dose chemotherapy (relapse 2, R2/P1) and a second cfDNA sample following additional rounds of chemotherapy including prednisone (relapse 3, R3/P5) (Figure 4A). We identified several distinct subclonal populations in these samples (Figure 6B) and selected mutations representative of each population: trunk (clonal), R2-associated (high prevalence at R2), and R3-associated (high prevalence at R3) for validation. We measured the variant allele frequency for these representative mutations in each time point and additional cfDNA samples and circulating tumor cells from blood collected between R2 and R3. This analysis revealed a heterogeneous clonal structure consisting of distinct subclones at each relapse (Figure 6C). Following R-CHOP
and high-dose chemotherapy (R2), we observed emergence of a population containing an MS4A1 truncating mutation and a missense mutation within the kinase domain of DDR2, which has been described in lung cancer and may confer susceptibility to dasatinib. This R2-associated subclone was undetectable at R3 and was replaced by a distinct population harboring a MS4A1 missense mutation (Gly98Arg) and a truncating mutation affecting NR3C1, which encodes the glucocorticoid receptor and could
Figure 5. Distribution and functional impact of MS4A1 mutations in rrDLBCL. (A) Topology of MS4A1 transmembrane domains and extracellular loops, as annotated by Uniprot and elsewhere.\textsuperscript{47} MS4A1 mutations observed in the rrDLBCL cohort have been labeled, along with the predicted binding epitope of 4 different CD20 mAbs. (B) Comparison of antibody binding between CHO-S cells transfected with plasmids expressing either WT CD20 or 1 of 3 mutants (Tyr86His, Tyr86Cys, and Leu66Arg) for 4 different CD20 antibodies: rituximab (RTX), tositumomab (B1), obinutuzumab (BHH-2), or ofatumumab (OFA). The percent of positively stained cells was compared between mutants within each antibody (adjusted \(P\) values from 2-way analysis of variance of 3 replicates: *\(P\) < .1, **\(P\) < .01, ***\(P\) < .001, ****\(P\) < .0001). See also supplemental Figure 5. (C) Representative western blot (of 2 independent experiments performed) showing CD20 expression of CHO-S cells transfected with WT or mutant CD20 (Y86H, Y86C, and L66R) and a nontransfected (NT) control. (D) Immunohistochemistry of CD20 in a cell line and tumor tissue biopsy harboring WT CD20 as well as 2 patient-derived cell lines harboring G98R (PT255), and Y86H along with a frameshift mutation, respectively. CD20 is stained red using the L26 CD20 antibody and B-cell nuclei were stained purple using a Pax5 antibody, visualized at \( \times 20 \) original magnification.
Figure 6.

**A**

**Patient 255 Timeline**

- **Clinical Time Point:** Diagnosis, Relapse 1, Relapse 2, Relapse 3
- **Time Point Label:** D, P2, P3, P4, P5, P6
- **DNA Source:** Biopsy, Plasma
- **Sequencing Type:** Exome

**B**

**Pyclone Cluster**

- **Cells prevalence**
- **Plasma time points:** D, P1, P5

**C**

**VAF**

- **WAF**
- **Plasma time points:** P1 to P6

**D**

**Mutation Groups**

- **Mutations**
  - Homozygous
  - Heterozygous

**Time Points**

- **Relapse 2 (P1)**
- **Relapse 3 (P5)**
contribute to resistance against steroids such as prednisone.25 Although some mutations present in this later population were detectable at low levels following deep sequencing at R2, the extent of clonal expansion was striking given that <3 weeks elapsed between R2 and R3. In particular, this subclone exhibited rapid clonal expansion in the 8 days separating samples P3 and P4. Taken together, these data show that rapid changes in clonal structure can contribute to treatment resistance in DLBCL.

Given the emergence of subclones with different genetic features, we next sought to validate the clonal dynamics observed in R2 and R3 using single-cell sequencing. We determined mutation status and ploidy for the same set of mutations in a total of 74 isolated single cells from R2 and 35 isolated cells from R3. This confirmed that the R2-associated and R3-associated subclones exist in mutually exclusive subpopulations and confirmed the subpopulation at R2 representing the dominant clone found at R3 (Figure 6D). This also revealed genetic features that could not be inferred from bulk sequencing alone, such as a 17p deletion affecting TP53 and TUSC5 in the R3-associated clone and MS4A1 loss of heterozygosity in the R2-associated clone. The MS4A1 missense (R3-associated) and frameshift (R2-associated) mutations were detected in the majority of cells from each time point and thus were interpreted to represent early events in the foundation and development of these individual subclones. The vast majority of cells (>99%) were negative for cell surface expression of CD20, consistent with each of these MS4A1 mutations causing loss of CD20 expression.

As rituximab can persist for weeks following treatment,36 these MS4A1 mutations likely provided the founder cells with a strong selective advantage, resulting in the independent emergence of multiple resistant subclones.

**Discussion**

By comparing the genetic landscapes of untreated and rrDLBCL, we highlight the potential role of 2 DLBCL-associated genes, KMT2D and TP53, as contributors to primary treatment resistance. Mutations affecting either gene were enriched in rrDLBCL and were typically clonal in matched pretreatment samples (Figure 4). TP53 is known to be associated with inferior patient outcomes in DLBCL9,10 and has been shown to be enriched for mutations in rrDLBCL7 and can contribute to resistance against chemotherapeutics, which induce DNA damage.37,38 For instance, mutations affecting Arg248, a residue critical in DNA-binding that was present in this later population were detectable at low levels following deep sequencing at R2, the extent of clonal expansion was striking given that <3 weeks elapsed between R2 and R3. In particular, this subclone exhibited rapid clonal expansion in the 8 days separating samples P3 and P4. Taken together, these data show that rapid changes in clonal structure can contribute to treatment resistance in DLBCL.

One barrier that has limited the genetic exploration of rrDLBCL is the lack of tissue biopsies, which are not routinely collected upon relapse. With sufficient levels of ctDNA, liquid biopsies have been shown to accurately reflect that mutational landscape of both the primary tumor and the distal sites.19 Collection of posttreatment liquid biopsies is gaining adoption as it can noninvasively inform on treatment response.30,22,43 and, as demonstrated herein, affords the opportunity for serial sampling such that clonal dynamics can be inferred within the context of treatment resistance. As some patients in this study exhibited rapid changes in population structure (Figure 6), noninvasive methods will be required to allow prospective detection of resistance-associated mutations.

In this study, mutations in MS4A1 recurrently exhibited clonal expansion following rituximab-based therapy (Figure 4). Single-cell analysis of a case harboring 2 mutually exclusive MS4A1-containing subclones revealed that these mutations were acquired after exposure to R-CHOP and became founder events for the multiple subclones that occurred at both relapses (Figure 6). Curiously, many MS4A1 mutations were not predicted to truncate the protein, and these missense variants did not directly affect the rituximab binding epitope. Prior work utilizing Sanger sequencing and a smaller rrDLBCL cohort also found limited evidence for MS4A1 mutations within the rituximab epitope,44 leaving the phenomenon of reduced CD20 expression unexplained. We explored the influence of these mutations on anti-CD20 antibody interactions and found that common missense mutations attenuated mAb recognition (Figure 5B), largely as a result of reduced expression, with patient-derived cell lines harboring these mutations appearing on CD20− (Figure 5D). Although the underlying mechanism of CD20 loss stemming from these transmembrane domain missense mutations remains unresolved, the most likely explanation is that

**Figure 6. Plasma and single-cell sequencing of multiple time points in a DLBCL patient (PT255).** (A) Timeline of events for PT255. Clinical time point shows the timing of diagnosis (D) and relapses (R2, relapse 2; and R3, relapse 3) relative to blood sample collection (P1 to P6). Bulk tumor DNA was separately obtained from a biopsy at diagnosis, circulating tumor cells extracted at R2 and R3, and ctDNA extracted from plasma samples P1 to P6 after R2. Varying types of sequencing was performed on DNA from each time point, as summarized below. (B) Results from running PyClone on exome sequencing of DNA obtained from diagnosis, R2(P1), and R3(P6). Clusters 0 and 1 contain trunk mutations seen at both P1 and P5; cluster 2 contains R2-specific mutations, and cluster 3 contains mutations that were subclonal at R2 and clonal at R3. (C) Amplicon sequencing of a subset of mutations found in the clusters in panel B from all 6 plasma time points reveal a more complete but similar evolution of the tumor as inferred from bulk sequence analysis in panel B. Below shows the suspected proportion of the tumor made up of each clone at individual time points. (D) Single-cell amplicon sequencing of circulating tumor cells taken at R2 and R3 revealed 2 distinct populations of cells containing mutations specific to each of R2 and R3. Genes are ordered by group and by frequency of mutation detected (top to bottom), suggesting a relative order of mutation acquisition.
they impair correct protein folding and subsequent stable expression, rather than simply destroying the antibody epitope(s), as 5 different mAbs were unable to detect expression, including one targeting the cytoplasmic domain in the C terminus. Given the low mutation frequency and low clonal prevalence of MS4A1 mutations prior to therapy, we hypothesize that these mutations provide limited (if any) fitness advantage until the tumor is exposed to anti-CD20 antibodies. Furthermore, this suggests additional unidentified mechanisms by which tumor cells inhibit CD20 surface expression, possibly through other genetic or epigenetic mechanisms. These findings reinforce the necessity of evaluating tissue biopsies following relapse for CD20 expression in trials including immunotherapy targeting this protein. These CD20− non-Hodgkin lymphoma cases are known to have poor outcomes with available therapies45 and thus represent a population in need of alternative therapies.

In summary, we have identified 6 genes that are significantly enriched in rDLBCL: KMT2D, TP53, CREBBP, NFKBIE, FOXO1, and MS4A1. The enrichment of KMT2D mutations in the rDLBCL population and its association with inferior outcome suggests distinct biology or natural history of these DLBCLs, as KMT2D and CREBBP mutations are among the most common genetic feature of FL. One explanation for our observations is that a substantial proportion of de novo DLBCLs result from occult transformation from FL. Further evidence supporting this possibility has recently been gleaned through the genetic analysis of DLBCLs with MYC and BCL2 translocations.46 In contrast to these early mutations, MS4A1 mutations are rare in untreated DLBCL and were generally undetectable prior to therapy. Our data indicate that these mutations directly contribute to rituximab resistance, resulting in rapid clonal selection and expansion in the presence of rituximab-containing therapy. Furthermore, our single-cell data highlight the significant clonal heterogeneity of rDLBCL, and the contribution of MS4A1 mutations toward rapid treatment resistance. The recurrent loss of CD20 expression in the rDLBCL population may have profound implications given the widespread use of rituximab and the ongoing targeting of CD20 with additional mAbs and more modern forms of immunotherapy.

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Authorship

For the Study Group: R.D.M., D.W.S., and N.A.J. conceptualized the study; R.D.M. provided the methodology; C.K.R. provided the software; C.K.R., S.E.A., M.A., A.J., K.M.C., N.T., L.K.H., K.L.S.C., and M.S.C. provided the formal analysis; C.K.R., S.E.A., M.A., R.N.R., K.M.C., and A.J. led the investigation; S.E.A., M.A., M. Cheung, N.M., S.D., J.D., R.N.R., K.B., S.Y., M.J., L.S., J.K., M. Crump, M.S.C., K.M., S.A., and N.A.J. provided the resources; C.K.R., M.A., and N.A.J. curated the data; C.K.R., S.E.A., M.A., R.D.M., D.W.S., and N.A.J. contributed to writing of the original draft; C.K.R., S.E.A., and R.D.M. provided the visualization; S.E.A. and C.K.R. contributed to the writing, review, and editing; R.D.M., N.A.J., and D.W.S. provided supervision; and R.D.M., D.W.S., N.A.J., J.M.C., M.A.M., and C.S. contributed to acquiring funding.

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