Clonal Architecture and Evolutionary History of Waldenström's Macroglobulinemia at the Single-Cell Level

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Summary statement

Our study shows for the first time the clonal architecture of Waldenström's macroglobulinemia at the single cell level, providing insight into how the oncogenic process can occur.

Abstract

To provide insight into the subclonal architecture and codependency patterns of the alterations in Waldenström's macroglobulinemia (WM), we performed single-cell

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mutational and protein profiling of eight patients. A custom panel was designed to screen for mutations and copy number alterations at the single-cell level in samples taken from patients at diagnosis (n=5) or at disease progression (n=3). Results showed that in asymptomatic WM at diagnosis, *MYD88^{L265P}* was the predominant clonal alteration, while other events, if present, were secondary and subclonal to *MYD88^{L265P}*. In symptomatic WM, clonal diversity was more evident, uncovering combinations of alterations that synergized to promote clonal expansion and dominance. At disease progression, a dominant clone was observed, sometimes accompanied by other less complex minor clones, which could be consistent with a clonal selection process. Clonal diversity was also reduced, probably due to the effect of treatment. Finally, we combined protein expression with mutational analysis to map somatic genotype with the immunophenotype. Our findings provide a comprehensive view of the clonality of tumor populations in WM and how clonal complexity can evolve and impact disease progression.

INTRODUCTION

Waldenström's Macroglobulinemia (WM) indolent, B-cell is distinct. а disorder characterized lymphoproliferative by bone marrow infiltration by lymphoplasmacytic lymphoma and the presence of an immunoglobulin M (IgM) monoclonal component (Dogliotti et al., 2023; Owen et al., 2003). The cellular composition of this IgM lymphoma is variable, including malignant small lymphocytes, plasmacytoid lymphocytes, and plasma cells in variable percentages (Stone & Pascual, 2010). At the clinical level, the disease is consistently heterogeneous, with a behavior ranging from indolent forms, such as IgM monoclonal gammopathy of undetermined significance (IgM-MGUS) and asymptomatic WM, to highly symptomatic disease (symptomatic WM), with evolution being highly variable as well (Oza & Rajkumar, 2015).

Over the past decade, much progress has been made in the molecular understanding of WM through next generation sequencing large-scale bulk analyses. Genomic characterization of WM tumor cells has identified recurrent somatic mutations in *MYD88* (>95% patients) and *CXCR4* (>30% patients) genes, and deletions involving chromosome 6q (del6q, ~50% patients), among other alterations (Hunter et al., 2014; Schop et al., 2002; Treon et al., 2012). *MYD88*^{L265P} mutation is considered to be the tumor-initiating event that provides an advantage for B-cell clonal selection and predisposes the malignant clone to further genetic alterations, leading to full-blown lymphoma development (Alcoceba et al., 2022; Argyropoulos et al., 2016; Sewastianik

et al., 2019). However, most alterations are present in both symptomatic and asymptomatic WM, so the global genomic profile cannot explain the differences in the clinical behavior and evolution of the disease (Jiménez et al., 2018; Varettoni et al., 2017). The cell-of-origin of WM, the order of the events, their distribution in individual tumor cells and clones, and how these interact may be of great relevance to the course of the oncogenic process. However, by bulk sequencing it is not possible to obtain that information, because cell identities are not preserved. Innovative single-cell sequencing technologies allow to dissect the tumor genetic heterogeneity and accurately measure clonal complexity, deciphering the patterns of somatic mutations across clonal populations (García - sanz & Jiménez, 2021). As tumors are constantly evolving, they often contain mutations that are relatively rare when they first emerge. Detecting these mutations and the clones that carry them may be of clinical importance for minimal residual disease, therapeutic resistance or disease progression and transformation (Demaree et al., 2021; Guess et al., 2022; Meyers et al., 2022; Nadeu et al., 2022; Robinson et al., 2022; Wang et al., 2022).

To date, there are few studies of WM at the single-cell level (Cholujova et al., 2023; Kaushal et al., 2021; Mondello et al., 2023; Rodriguez et al., 2022; Sun et al., 2022). Only one of these studies is based on DNA-sequencing, and although it allowed to identify the presence of MYD88^{L265P} in B-cell precursors, it did not provide data on the order of mutation acquisition, co-mutation patterns, or how the mutational landscape fluctuates over the course of the disease (Rodriguez et al., 2022). We have performed an integrated single-cell DNA sequencing and immunophenotyping study to establish the sequence of genetic events, the target populations in which they arise, and the codependency/exclusion of alterations. We have analyzed the cell populations at baseline and following therapy to better understand the tumor architecture and evolutionary trajectories underlying the oncogenic process. The correlation with the immunophenotype provided information about the different cell populations present and whether they were part of the neoplastic clone.

RESULTS

A total of 42,352 cells were used for single-cell analysis (median 3839 cells/patient; range, 1031–11307 cells). Patients' medical history and immunophenotype of the samples used (marked in bold) are described in Table 1.

Tumor architecture & order of the events

First, analysis showed that *MYD88^{/265P}* was the most clonal alteration at diagnosis. MW1 and MW2 were both diagnostic samples of asymptomatic WM. *MYD88* mutation defined the main tumor clone in these patients (it was present in 91.5% and 26.5% of cells, respectively). Part of the clone (~25% and ~16% of cells, respectively) had acquired del6q, confirming that it was a secondary alteration that appears after *MYD88* mutation (Fig. 1A-B). In MW3 and MW4 (both symptomatic WM at diagnosis), *MYD88^{/265P}* was also clonal (80.4% and 89.7% of cells, respectively), but no further alterations were detected. MW5 was diagnosed as IgM-MGUS (in 2017), and four years later progressed to symptomatic WM. We analyzed the sample of progression to symptomatic WM. At that time, two subclones could be differentiated: *MYD88*-del6q-del17p-amp3q (12.2%, colored in blue in Fig. 1C), and *MYD88*-del6q-CXCR4 (1.2%, in yellow). Both had in common *MYD88^{/265P}* and del6q, but then one of the subclones acquired a *CXCR4* mutation, while the other one acquired del17p and amp3q. A branching model of disease evolution can be inferred based on this clonal distribution (Fig. 1C).

In samples taken at the time of disease progression, the scenario changed. The secondary alterations were (mostly) present in the same cells as MYD88^{L265P}. MW6 was a symptomatic WM, and we analyzed the sample of progression after the second line of treatment. The main tumor clone of this patient (56.8% of cells) presented CXCR4 mutation and was homozygous for MYD88^{L265P} possibly due to an acquired uniparental disomy (aUPD) of chr3. Interestingly, there were two additional small subclones without the loss of the chr3 copy: one with the MYD88 mutation only (0.6%), and the second one with both MYD88 and CXCR4 mutations (2.5%) (Fig. 1D). These two small clones could represent the initial clones, which shed light on how the oncogenic process may have occurred. MW7 was first diagnosed as IgM-MGUS, and 10 years later progressed to symptomatic WM. The sample analyzed was the progression after the first line of treatment. The alterations this patient had (del6q and amp3g) co-occurred in the same cells as MYD88 mutation, and in this case, there were no remaining cells representing any potential ancestor (Fig. 1E). Finally, MW8 was a patient diagnosed as asymptomatic WM, who progressed to symptomatic WM. The sample included corresponded to the time of progression after ibrutinib therapy (second line). This sample had a del6q that, according to FISH results, was not present in the samples at diagnosis or when the patient progressed to symptomatic WM. The subclone having this alteration (~6.6% of the CD19+ cells), along with delTRAF3, may

therefore be considered emergent at the time of ibrutinib progression (Fig. 1F). Predicted evolution of the events based on these observations is presented in Fig. S1).

Co-occurrence & exclusion of alterations

Next, we investigated the co-dependency and exclusion of alterations at single-cell resolution. As we have just mentioned, we detected *MYD88^{L265P}* variant in all patients (8/8), defining the main clone and supporting its role as the tumor-initiating event. Secondary oncogenic events, such as del6q (present in 5/8 patients), *CXCR4* mutations (2/8 patients), amp3q (2/8 patients), del*TRAF3* (1/8 patients), and del17p (1/8 patients), accompanied *MYD88* mutation. *CXCR4* mutations were subclonal to *MYD88* at diagnosis (MW5, Fig. 1C), but not at disease progression (MW6, Fig. 1D), as it happened with amp3q (MW5, Fig. 1C, and MW7, Fig. 1E, respectively). Del6q was subclonal to *MYD88* at diagnosis in asymptomatic WM (MW1 and MW2, Fig. 1A,B) but not in symptomatic WM (MW5, Fig. 1C). Finally, the aUPD of chr3 co-ocurred with *CXCR4* mutation (MW6, Fig. 1D).

We also observed that alterations with a common role could concur in the same cells. Thus, deletions of two negative regulators of the NF- κ B signaling pathway, *TRAF3* and *TNFAIP3* (i.e., del6q), co-occurred in the same subclone in one patient (MW8, Fig. 1F). Del6q (*TNFAIP3*) also coexisted with amp3q, which includes *TBL1XR1*, a gene involved in the activation of NF- κ B, in two patients (MW5, Fig. 1C, and MW7, Fig. 1E). On the contrary, del6q always showed mutual exclusivity with *CXCR4* mutations, except in a minority subclone of one patient, suggesting they are two different pathways that can promote disease progression. In the majority clone of this patient, del6q co-occurred with del17p and amp3q (MW5, Fig. 1C). However, all findings are based on very few numbers and therefore must be interpreted with caution.

MYD88^{L265P} in normal B cells

MYD88 mutation has been recently found in immunophenotypically normal B cells of WM patients (Kaushal et al., 2021; Rodriguez et al., 2022). To confirm these findings, we compared the percentage of clonal B cells by FCM, defined by the monoclonal light chain restriction, with the percentage of cells having *MYD88* mutation. For results to be comparable, we calculated the percentage of tumor cells out of the total mononuclear cells (in patients MW2, MW5, MW6 & MW7), and out of the total CD19+ cells in samples with CD19 negative depletion (i.e., MW1, MW3, MW4 & MW8). Overall, numbers were similar, but patients MW2, MW3 & MW6 presented a higher percentage

of *MYD88*-mutated cells (26.5%, 80.4%, and 59.9%, respectively) than clonal cells (B lymphocytes and plasma cells) by FCM (20.4%, 63%, and 45.2%, respectively), which concurs with the existence of *MYD88*-mutated non-clonal cells.

Single-cell protein sequencing analysis

Protein analysis was based on the expression of CD34, CD19, CD20 and CD38 antigens. Protein libraries of patients MW2 and MW4 failed (so no expression data were available for these cases), and CD19 antibody did not work in MW7. According to FCM data. immature cells (named B-cell precursors) were defined as CD34+CD19+CD20-CD38+, B lymphocytes as CD34-CD19+CD20+CD38-, and plasma cells/plasmacytoid lymphocytes as CD34-CD19+CD20+CD38+. Cells with a phenotype not consistent with any of the above were removed from the final plots. Clonality of B cells could not be assessed based on these markers.

Despite these difficulties, analysis showed that alterations were present in all cell populations, and likewise, all populations had wild-type cells (at least for the alterations evaluated with this panel) (Fig. S2A,C). In addition, slight phenotypic differences could be observed in mutated vs. wild-type cells within each population (Fig. S2A) and in all cells in patients in whom CD19-selection was not performed (Fig. S2B): MW5 (CD19 and CD38 expression), MW6 (CD19, CD38 and CD34 expression), and MW7 (CD20 and CD38 expression). Thus, mutated cells expressed CD19 or CD20 more strongly, while CD34 and CD38 expression was weaker than in unmutated cells (Fig. S2B). In samples with depletion of CD19 negative cells (MW1, MW3 and MW8), these differences could not be so well appreciated because most cells were *MYD88*-mutated (Fig. S2C-D). In MW1, when we clustered the cells based on protein expression, we could observe that the 6q region studied (genes *IBTK*, *PRDM1*, *BCLAF1* and *TNFAIP3*) was not completely and equally deleted in all cells, appearing that *TNFAIP3* was the first gene to be deleted, and the most common in the immature cells (Fig. 2).

DISCUSSION

The genomic landscape of WM has been well described, and allowed to characterize disease mechanisms and to identify biomarkers and therapeutic targets (Braggio et al., 2009; Hunter et al., 2014; Jiménez et al., 2018; Poulain et al., 2013; Schop et al., 2002; Treon et al., 2012; Varettoni et al., 2017). By bulk sequencing, it is possible to infer patterns of clonality, sub-clonality and clonal evolution using VAF distribution. However,

single-cell techniques can provide more detailed and direct approaches to study intratumor heterogeneity and clonal architecture. Here we have performed a single-cell DNA and protein sequencing study in WM with the Tapestri platform. Single-cell analysis assigns alterations to different clones allowing to reconstruct tumor evolutionary histories and to identify disease-initiating events, as well as cooperative mutations that give cells a fitness advantage (Navin et al., 2011).

Genetic evidence supports a stepwise accumulation of genomic alterations (mutations, copy-number abnormalities, loss of heterozygosity) during WM development, suggesting they have a role in the multistep oncogenic process that drives this transition (Jiménez et al., 2018; Paiva et al., 2015; Poulain et al., 2013; Varettoni et al., 2017). Thus, we found that clonal complexity increased as disease evolved, but that could also be reduced due to the effect of treatment. The presence of more mature subclonal populations with higher number of genetic alterations (MYD88, CXCR4, del6q, del17p, amp3q) was associated with more advanced and symptomatic disease that required treatment. Considering the distribution of the alterations within the different subclones and their respective clonality, we proved that MYD88^{L265P} was the common driver event, and that only clones containing MYD88 mutation gave rise to more aggressive populations by acquiring new alterations. Depending on the clone in which they arise, these alterations may give certain cells a fitness advantage, resulting in the intraclonal heterogeneity seen in WM and the different models of tumor evolution (Bolli et al., 2014; Greaves & Maley, 2012). Patient MW5 could represent an example of branched evolution, as two separated subclones (one with del17p and amp3q, and the other with CXCR4 mutation) derived from a common ancestor that harbored MYD88^{L265P} and del6q. The expansion of both clones is restrained by a mutual competition known as clonal interference (Anderson et al., 2011).

Previous studies point that there might be at least two distinct oncogenic pathways that promote progression to symptomatic disease in WM: mutated *CXCR4* and del6q (Cao et al., 2015; Guerrera et al., 2018; Hunter et al., 2016; Roccaro et al., 2014). Loss of chromosome 6q is found in 40-50% of patients with WM and appears exclusive of *CXCR4* in treatment-naïve patients, suggesting shared roles for the two genomic events (Guerrera et al., 2018; Schop et al., 2002). We found del6q in 5/8 patients, showing mutual exclusivity with *CXCR4* mutations in all but one patient (MW5), and even in this case, the subclone in which both alterations co-occurred was minority. The predominant subclone of this patient had del6q, amp3q and del17p, suggesting these are cooperative alterations that provide cells a proliferative advantage. We also found other alterations that induce the same mechanism, such as del6q and del*TRAF3*, or

The changes in the tumor architecture observed at disease progression could be attributed to a cancer-clone evolutionary selection for more robust or malignant phenotypes (Greaves & Maley, 2012). In patient MW6, the few remaining cells having less alterations (MYD88^{L265P} alone or MYD88^{L265P} plus CXCR4 mutation) than the main clone could represent the initial clones, illustrating how the oncogenic process may have occurred: MYD88^{L265P} was the initial oncogenic event, then CXCR4 mutation was acquired and finally, the aUPD of chr3, both being present in the same subclone. The aUPD may have potentially contributed to clonal evolution by rendering tumor cells homozygous for a pre-existing oncogenic mutation (MYD88^{L265P}) (Treon et al., 2016). In MW7 the scenario was similar, but since no remnants of the potential initial clones could be observed, the temporal ordering of genomic events could not be inferred. Both functionally relevant mutational events and therapy can drive clonal selection, but to gain more detailed insight into clonal trajectories in individual patients, this issue needs to be best addressed by serial sampling (Bolli et al., 2014; Greaves & Maley, 2012). Our last case (MW8) may exemplify the emergence of *new* clones resistant to therapy. Del6q has been associated to disease progression (García-Sanz et al., 2021) and ibrutinib resistance in WM (Jimenez et al., 2020). Since this alteration was not present in the previous moments (according to FISH), it could be hypothesized that the subclone with del6q and delTRAF3 is responsible for the treatment resistance acquisition, especially considering that the patient did not have mutations in BTK (Xu et al., 2017). However, considering that the sensitivity of FISH does not reach the singlecell level, we also cannot discard the possibility that new selective pressures (i.e., ibrutinib therapy) had allowed pre-existing cancer cells that survived treatment to emerge. Alterations in CXCR4, have also been reported as associated with drug resistance, including resistance to Ibrutinib (Cao et al., 2015; Roccaro et al., 2014; Treon et al., 2015). In our series, only two patients harbored these alterations but did not show treatment resistance.

Single-cell techniques allow not only to establish the events order, but also the sequence of acquisition of structural variants. In the asymptomatic WM (MW1), among the genes we evaluated, *TNFAIP3* seemed to be the most frequently deleted gene, which suggests that del6q may begin to happen around this area. In symptomatic WM, the entire 6q region evaluated was equally deleted.

Contrary to other works (Rodriguez et al., 2022), we did not find wild-type MYD88 in tumor cells carrying other genetic lesions, at least for the alterations we studied. However, based on the comparison of the tumor infiltration by flow cytometry and the percentage of cells carrying MYD88 mutation by single-cell analysis, we were able to confirm that this alteration can be present in phenotypically normal B cells of WM patients (Rodriguez et al., 2022). Emerging evidence has suggested that MYD88^{L265P} would arise during hematopoietic development, although not always at the same cellular stage, and that parallel clonal expansions occur before subclones begin to dominate in early cancer development but are rare after cell transformation (Anderson et al., 2011; Rodriguez et al., 2022; Siegmund et al., 2009). Most somatic mutations present in progenitor cells are undetectable in mature B lymphocytes, suggesting continuous clonal selection until oncogenic alterations appear and cause the transformation. We have observed slight differences in the immunophenotype of MYD88-mutated compared to wild-type cells. Therefore, one might think that the acquisition of MYD88 mutation would be accompanied by changes in the immunophenotype as the B-cell clone progressively grows and evolves. The immune microenvironment has been shown to play a critical role in this transition (Kaushal et al., 2021).

Single-cell data may have biological and therapeutic relevance in the future. Intratumor heterogeneity has been shown to be prognostic in certain cancer types and can also explain the partial efficacy of targeted therapies (Andor et al., 2016; Landau et al., 2013; Rocco, 2015; Yates et al., 2015) or why it is impossible to achieve complete responses with BTK inhibitors as monotherapy in WM (Buske et al., 2022; Tam et al., 2020). Current treatment approaches typically consider the disease to be static and homogeneous. Understanding the heterogeneity within tumors and their ability to evolve in response to therapy may allow to design interventions to disrupt clonal evolution and/or target WM as a multi-clonal disease. Also, the identification of subclones potentially associated with treatment resistance may allow the use of preventive therapeutic strategies.

We are aware of the limitations of our study, especially the number of patients, not having sequential samples, the gene panel size, and the use of a new methodology. Nevertheless, our results are supported by FISH and flow cytometry studies.

In summary, we have precisely characterized the clonal architecture of WM at the single-cell level for the first time. Our work including the different stages of WM (asymptomatic, symptomatic, and symptomatic post-therapy) provides information

about how disease initiates and progresses, the timing of the alterations (early vs. late), the cooperative mutations, and the patterns of evolution.

MATERIALS AND METHODS

Patients and samples

Eight WM patients –five at diagnosis and three at the time of disease progression– were included in the study. Cases were diagnosed using standard WHO classification criteria (2016 update) (Swerdlow et al., 2016), which was fully concordant with the new updates (Alaggio et al., 2022; Campo et al., 2022). Samples were selected based on the tumor infiltration detected by flow cytometry (FCM) during the standard diagnostic process. Mononuclear cells were isolated from bone marrow by Ficoll-Paque densitygradient centrifugation, and CD19 negative cells were removed with the EasySep[™] Human B Cell Enrichment Kit (STEMCELL Technologies, Inc.) when sufficient cells were available (patients MW1, MW3, MW4 and MW8). Cells were preserved in fetal bovine serum with 10% DMSO (dimethyl sulfoxide) at -80° until used for single-cell studies. Previous and/or subsequent samples from these patients were evaluated by FISH, flow cytometry and molecular studies to help understand the evolutionary history of the tumors. The study was approved by the ethics committee following the ethical recommendations and guidelines of the Declaration of Helsinki. Written informed consent was obtained from all eight patients.

Single-cell DNA and protein sequencing

We designed a Tapestri[™] Single-Cell DNA Custom Panel of 112 amplicons (Mission Bio, San Francisco, CA) covering the hotspot regions of 20 genes (*MYD88, CXCR4, ARID1A, KMT2D, TP53, CD79A, CD79B, NOTCH2, TRAF2, TRAF3, MYBBP1A, HIST1H1E, KLF2, TBL1XR1, PTPN13, RAG2,* and *IBTK, PRDM1, BCLAF1* and *TNFAIP3*, for the assessment of 6q deletion), and an antibody-oligo conjugated panel targeting the following surface proteins: CD19, CD20, CD34, CD38, and CD138. CD34 oligo-conjugated antibody was used in a 1:2 dilution, CD38 in a 1:5 dilution, and the remaining antibodies were used without dilution. Due to its overexpression compared to the other proteins, CD138 was removed from the final analysis.

Simultaneous profiling of DNA mutation and cell-surface immunophenotype was performed according to the manufacturer's protocol. Cell suspensions had to contain

6,000-10,000 cells/µl at ≥80% viability to be processed. Briefly, cryopreserved bone marrow mononuclear cells were thawed, quantified, and stained with the pool of 5 oligo-conjugated antibodies. The stained cells were washed and loaded into the Tapestri instrument for single-cell encapsulation, lysis, and barcoding. Targeted amplification using multiplexed PCR occurred within the droplets. DNA and protein PCR products were then isolated from the individual droplets, purified with AMPure XP beads (Beckman Coulter, Inc.) and streptavidin beads (Thermo Fisher Scientific, Inc.), and used for library generation. DNA and antibody-tagged final libraries were quantified using Qubit 4 fluorometer (Thermo Fisher Scientific, Inc.) and pooled for sequencing on a NextSeq 1000/2000 sequencer (Illumina, San Diego, CA) using 2x150 bp cycles.

Data analysis

Raw FASTQ files were processed with the Tapestri pipeline v2 (Mission Bio), which includes adapter-trimming using Cutadapt, alignment to the reference human genome GRCh37/hg19 using Burrows-Wheeler Aligner, cellular barcode demultiplexing, and cell-based genotype calling using GATK/HaplotypeCaller. The output .loom files were analyzed using Tapestri Insights (v2.2), filtering out low-quality genotypes and cells (i.e., genotype quality <30, reads/cell/target <10, mutant variant allele frequency (VAF) <20%, variants mutated in <1% of the cells, and cells with <50% of genotypes present). The python-based Mosaic analysis package (https://github.com/MissionBio/mosaic) was used for more advanced multiomics analysis and data visualization of the .h5 files. Only cells with complete genotype information of the variants selected for downstream analysis were included.

Flow cytometry immunophenotyping

Bone marrow samples were processed following the general recommendations of the EuroFlow group (Kalina et al., 2012) and stained with at least an 8-color panel including the following monoclonal antibodies combined in several tubes: surface immunoglobulin-M (SIgM), CD5, CD19, CD20, CD22, CD23, CD25, CD27, CD38, CD45, CD56, CD79b, CD81, CD117, CD138, and intracytoplasmic IgM (CyIgM), kappa (CyK) and lambda (Cyλ). A minimum of 1 million cells were acquired per tube in a FACSCalibur flow cytometer (Becton Dickinson Biosciences, San Jose, CA) using BD FACSDiva[™] software v6.1. Data were analyzed using Infinicyt[™] software v2.0 (Cytognos, Salamanca, Spain). Light chain-restricted clonal lymphocytes (CD19+) and

plasma cells (CD38+ or strong CD138+) were quantified (Paiva et al., 2014; Puig et al., 2017).

FISH studies

Simple interphase fluorescence in situ hybridization (FISH) was performed on cell nuclei of CD19+ cells from bone marrow samples using our previously published techniques (Ocio et al., 2005). Deletions of 6q and 17p, and translocations of 14q32 were evaluated. At least 100 cells were analyzed in all samples, applying Vysis scoring criteria (Abbott Laboratories, Abbott Park, IL). The cutoff point for the identification of an alteration was set at ≥10% cells with an abnormal signal.

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Competing interests

No competing interests declared.

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Author contributions

Conceptualization and designing: R.G.S., C.J.; Methodology and investigation: R.G.S., M.G.A., M.A., C.J.; Providing patients and clinical data: R.G.S., E.A., V.G.C., M.C., F.E.B., A.B., J.M.A., M.G.; Analysis and results interpretation: M.G.A., A.M., I.T.L., M.B.B., N.V.B., M.E.S., M.C.C., M.A., C.J.; Writing—original draft preparation: C.J.; Writing—review and editing: R.G.S.; Funding acquisition: R.G.S., C.J.

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Figures and Table



Fig 1. Clonal architecture of different disease stages of Waldenström's macroglobulinemia at the single-cell level.

(A) Presence of wild-type (green) versus heterozygous *MYD88^{L265P}* (red) and deletion of 6q (blue) in an asymptomatic Waldenström's macroglobulinemia patient at diagnosis (MW1). Rows represent the individual cells and columns represent the regions covered by the panel amplicons. Color scale indicates the number of normalized reads for copy number alterations. (B) Presence of wild-type (green) versus heterozygous *MYD88^{L265P}* (red) and deletion of 6q (blue) in an asymptomatic Waldenström's macroglobulinemia patient at diagnosis (MW2). Rows represent the individual cells and columns represent the regions covered by the panel amplicons. Color scale amplicons. Color scale indicates the number of normalized reads for copy number at diagnosis (MW2). Rows represent the individual cells and columns represent the regions covered by the panel amplicons. Color scale indicates the number of normalized reads for copy number alterations.

(C) Distribution of somatic variants (*MYD88^{L265P}* and *CXCR4^{S344*}*) and copy number alterations (deletion of 6q, deletion of 17p and amplification of 3q) in a patient with symptomatic Waldenström's macroglobulinemia at diagnosis (MW5). Rows represent

the individual cells and columns represent the regions covered by the panel amplicons. Color scale indicates the number of normalized reads for copy number alterations.

(**D**) Distribution of somatic variants (*MYD88^{L265P}*, heterozygous and homozygous, and *CXCR4^{S338*}*) in one symptomatic Waldenström's macroglobulinemia patient at disease progression (MW6). Rows represent the individual cells and columns represent the regions covered by the panel amplicons. Color scale indicates the number of normalized reads for copy number alterations. (**E**) Distribution of somatic variants (heterozygous *MYD88^{L265P}*) and copy number alterations (deletion of 6q and amplification of 3q) in one symptomatic Waldenström's macroglobulinemia patient at disease progression (MW7). Rows represent the individual cells and columns represent the regions covered by the panel amplicons. Color scale indicates the number of normalized reads for copy number alterations. Color scale indicates the number of normalized reads for copy number alterations.

(F) Presence of *MYD88^{L265P}*, deletion of 6q and deletion of *TRAF3* in one patient with symptomatic Waldenström's macroglobulinemia at the time of disease progression. Rows represent the individual cells and columns represent the regions covered by the panel amplicons. Color scale indicates the number of normalized reads for copy number alterations.



Fig. 2. Copy number alterations in selected regulatory regions of 6q in one patient with asymptomatic Waldenström's macroglobulinemia. Rows represent the individual cells and columns represent the amplicons of 6q region. Yellow-blue color scale indicates the copy number alterations. The number of deleted amplicons/genes differed between cells, being TNFAIP3 the most frequently deleted gene.

ID	Time-	Year	Disease	Treatment	Del6q	Immunophenotype
	point				by	
	•				FISH	
MW1	Diagnosis	2021	asymptomatic	-	-	10.1% B-cells: CD19+CD20+CD38-
CD19	g		WM			0.2% PC/LP: CD19+CD20-
- CD 10						/+(71%)CD38+laM+CD56-CD5-
•						CvK+CD81+CD117-CD79h-
						/+(71%)CD27+CD45+
						1 5% normal R colla
	Diamagia	2024			200/	
IVIVVZ	Diagnosis	2021	asymptomatic	-	39%	6.2% B-cells: CD19+CD20+CD38+
			VVIVI			0.5% LP: CD19+CD20+CD38+CD22-
						CD25-CyK+CD45+IgM+
						0.5% normal B-cells
MW3	Diagnosis	2021	symptomatic WM	-	-	2.3% B-cells: CD19+w CD20+CD38-
CD19						0.2% PC/LP: CD19+CD20-
+						/+w(35%)CD38+CD138+w IgM+
						1.4% normal B-cells
MW4	Diagnosis	2021	symptomatic WM	-	no	10.5% B-cells: CD19+w CD20+CD38-
CD19						0.6% PC: CD19+CD20-/+w
+						CD38+IgM++CD56-CD5-
						CyK+CD81+CD117-CD79b+w
						CD27+CD45+
						1% normal B-cells
MW5	Diagnosis	2017	IgM-MGUS	-	-	
	Diagnosis	2021	symptomatic WM	BTKi (1 st line)	-	10.6% B-cells: CD19+CD20+CD38-
	J		.,			1% LP: CD20+CD38+w IaM+CD56-
						CvK+CD27-/+w HI ADR+CD79b+CD45+
						0.3% normal PC
						0.2% normal B-cells
M\\/6	Diagnosis	2014	symptomatic W/M	DRC (1 st line): PR	no	
	Drogrossio	2014	Symptomatic WW	bondomusting and	0	
	riogressio	2015		rituvimob (2 nd lino): DD	no	
		0004				
	Progressi	2021		ibrutinib (3 rd line): PR	no	25.4% B-cells: CD19+CD20+w CD38-
	on					CD22+w CD25+CyA+CD45+
						1% PC: CD19+CD38++CyK+
						0.2% normal B-cells
MW7	Diagnosis	2001	IgM-MGUS	-	-	
		2008		-	29%	
	Diagnosis	2011	symptomatic WM	DRC (1 st line): PR	-	
	Progressi	2021		ibrutinib (2 nd line): SD	-	13% B-cells: CD19+CD20+CD38+w
	on					СD10-CD45+СуК+Суλ-
						0.01% PC
						0.04% normal B-cells
	Progressio	2022		rituximab (3 rd line): PR	-	
	n					
MW8	Diagnosis	2014	asymptomatic WM	-	no	
CD19	Ŭ					
т – т.						

Table 1. Patients' characteristics.

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Diagnosis	2015	symptomatic WM	BDR (1 st line): SD	-	
Progressio n	2016		ibrutinib (2 nd line): PR	no	
Progressi on	2021		anti-MALT1 (3 rd line)	25%	25% B-cells: CD19+CD20+CD38-/+w IgM+w Cyλ+CD45+ 2.1% LP: CD19+CD20+CD38+w CyL+CD45+ 0.04% normal PC 1.1% normal B-cells
Progressio n	2022		anti-BCL2 (4 th line): SD	16%	
Progressio n	2022		BTKi (5th line)	11%	

BCL2, B-cell CLL/Lymphoma 2; BDR, bortezomib, dexamethasone and rituximab; BTKi, Bruton's tyrosine kinase inhibitor; Cy, intracytoplasmic; del6q, deletion of chromosome 6q; DRC, dexamethasone, rituximab and cyclophosphamide; FISH, fluorescence in situ hybridization; IgM, immunoglobulin M; LP, lymphoplasmacytes; MALT1, mucosa-associated lymphoid tissue lymphoma translocation protein 1; MGUS, monoclonal gammopathy of uncertain significance; PC, plasma cells; PR, partial response; SD, stable disease; w, weak; WM, Waldenström's macroglobulinemia



Fig. S1. Fishplots representing the hypothesized evolution of the clones in eight Waldenström's macroglobulinemia patients. The proposed order of the events was inferred based on single-cell data, FISH results, and the patients' clinical history.



Het, heterozygous; Hom, homozygous; PC/LP, plasma cells/plasmacytoid lymphocytes; WT, wild-type

Fig. S2. Combined representation of genotype and phenotype of Waldenström's macroglobulinemia single cells.

(A) Genotype and phenotype of the cell populations in three Waldenström's macroglobulinemia patients. Cells were clustered based on the expression of CD19, CD20, CD34 and CD38 antigens and designated as the different cell populations (B lymphocytes, B-cell precursors, and plasma cells). Status of the somatic variants (*MYD88* and *CXCR4*) within each population is represented in green and blues. Rows represent the individual cells and columns represent the somatic mutations and the antigen expression. Color scale indicates the intensity of antigen expression.



(B) Antigen expression in the single cells clustered by genotype of three Waldenström's macroglobulinemia patients. Expression of CD19, CD20, CD34, and CD38 is different in (*MYD88* and *CXCR4*) mutated cells compared to wild-type cells. Rows represent the individual cells and columns represent the antigen expression. Color scale indicates the intensity of antigen expression.



Het, heterozygous; PC/LP, plasma cells/plasmacytoid lymphocytes; WT, wild-type

(C) Genotype and phenotype of the cell populations in three Waldenström's macroglobulinemia patients. Cells were clustered based on the expression of CD19, CD20, CD34 and CD38 antigens and designated as the different cell populations. Status of the somatic variant (*MYD88*^{L265P}) within each population is represented in green and blue. Rows represent the individual cells and columns represent the somatic mutations and the antigen expression. Color scale indicates the intensity of antigen expression. As these were CD19 negative depleted samples, most cells were *MYD88*-mutated, and no differences in the antigen expression could be observed based on the genotype.



(D) Antigen expression in the single cells clustered by genotype of three Waldenström's macroglobulinemia patients. As these were CD19 negative depleted samples, most cells were *MYD88*-mutated, and no differences in the antigen expression could be observed in mutated cells compared to wild-type cells. Rows represent the individual cells and columns represent the antigen expression. Color scale indicates the intensity of antigen expression.