

Frequent mutation of histone-modifying genes in non-Hodgkin lymphoma

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Follicular lymphoma (FL) and diffuse large B-cell lymphoma (DLBCL) are the two most common non-Hodgkin lymphomas (NHLs). Here we sequenced tumour and matched normal DNA from 13 DLBCL cases and one FL case to identify genes with mutations in B-cell NHL. We analysed RNA-seq data from these and another 113 NHLs to identify genes with candidate mutations, and then re-sequenced tumour and matched normal DNA from these cases to confirm 109 genes with multiple somatic mutations. Genes with roles in histone modification were frequent targets of somatic mutation. For example, 32% of DLBCL and 89% of FL cases had somatic mutations in *MLL2*, which encodes a histone methyltransferase, and 11.4% and 13.4% of DLBCL and FL cases, respectively, had mutations in *MEF2B*, a calcium-regulated gene that cooperates with CREBBP and EP300 in acetylating histones. Our analysis suggests a previously unappreciated disruption of chromatin biology in lymphomagenesis.

Non-Hodgkin lymphomas (NHLs) are cancers of B, T or natural killer lymphocytes. The two most common types of NHL, follicular lymphoma (FL) and diffuse large B-cell lymphoma (DLBCL), together comprise 60% of new B-cell NHL diagnoses each year in North America¹. FL is an indolent and typically incurable disease characterized by clinical and genetic heterogeneity. DLBCL is aggressive and likewise heterogeneous, comprising at least two distinct subtypes that respond differently to standard treatments. Both FL and the germinal centre B-cell (GCB) cell of origin (COO) subtype of DLBCL derive from germinal centre B cells, whereas the activated B-cell (ABC) variety, which has a more aggressive clinical course, is thought to originate from B cells that have exited, or are poised to exit, the germinal centre². Current knowledge of the specific genetic events leading to DLBCL and FL is limited to the presence of a few recurrent genetic abnormalities². For example, 85–90% of FL and 30–40% of GCB DLBCL cases^{3,4} harbour t(14;18)(q32;q21), which results in deregulated expression of the BCL2 oncogene. Other genetic abnormalities unique to GCB DLBCL include amplification of the *c-REL* gene and of the miR-17-92 microRNA cluster⁵. In contrast to GCB cases, 24% of ABC DLBCLs harbour structural alterations or inactivating mutations affecting *PRDM1*, which is involved in differentiation of GCB cells into antibody-secreting plasma cells⁶. ABC-specific mutations also affect genes regulating NF- κ B signalling^{7,8,9}, with *TNFAIP3* (also known as *A20*) and *MYD88* (ref. 10) the most abundantly mutated in 24% and 39% of cases, respectively. To enhance our understanding of the genetic architecture of B-cell NHL, we undertook a study to (1) identify somatic mutations and

(2) determine the prevalence, expression and focal recurrence of mutations in FL and DLBCL. Using strategies and techniques applied to cancer genome and transcriptome characterization by ourselves and others^{11,12,13}, we sequenced tumour DNA and/or RNA from 117 tumour samples and 10 cell lines (Supplementary Tables 1 and 2) and identified 651 genes (Supplementary Figure 1) with evidence of somatic mutation in B-cell NHL. After validation, we showed that 109 genes were somatically mutated in two or more NHL cases. We further characterized the frequency and nature of mutations within *MLL2* and *MEF2B*, which were among the most frequently mutated genes with no previously known role in lymphoma.

Identification of recurrently mutated genes

We sequenced the genomes or exomes of 14 NHL cases, all with matched constitutional DNA sequenced to comparable depths (Supplementary Tables 1 and 2). After screening for single nucleotide variants followed by subtraction of known polymorphisms and visual inspection of the sequence read alignments, we identified 717 non-synonymous variants (coding single nucleotide variants; cSNVs) affecting 651 genes (Supplementary Figure 1 and Supplementary Methods). We identified between 20 and 135 cSNVs in each of these genomes. Only 25 of the 651 genes with cSNVs were represented in the cancer gene census (December 2010 release)¹⁴.

We performed RNA sequencing (RNA-seq) on these 14 NHL cases and an expanded set of 113 samples comprising 83 DLBCL, 12 FL and 8 B-cell NHL cases with other histologies and 10 DLBCL-derived cell lines (Supplementary Table 2). We analysed these data to identify

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novel fusion transcripts (Supplementary Table 3) and cSNVs (Fig. 1). We identified 240 genes with at least one cSNV in a genome/exome or an RNA-seq ‘mutation hot spot’ (see later), and with cSNVs in at least three cases in total (Supplementary Table 4). We selected cSNVs from each of these 240 genes for re-sequencing to confirm their somatic status. We did not re-sequence genes with previously documented mutations in lymphoma (for example, *CD79B*, *BCL2*). We confirmed the somatic status of 543 cSNVs in 317 genes, with 109 genes having at least two confirmed somatic mutations (Supplementary Tables 4 and 5). Of the successfully re-sequenced cSNVs predicted from the genomes, 171 (94.5%) were confirmed somatic, 7 were false calls and 3 were present in the germ line. These 109 recurrently mutated genes were significantly enriched for genes implicated in lymphocyte activation ($P = 8.3 \times 10^{-4}$; for example, *STAT6*, *BCL10*), lymphocyte differentiation ($P = 3.5 \times 10^{-3}$; for example, *CARD11*), and regulation of apoptosis ($P = 1.9 \times 10^{-3}$; for example, *BTG1*, *BTG2*). Also significantly enriched were genes linked to transcriptional regulation ($P = 5.4 \times 10^{-4}$; for example, *TP53*) and genes involved in methylation ($P = 2.2 \times 10^{-4}$) and acetylation ($P = 1.2 \times 10^{-2}$), including histone methyltransferase (HMT) and acetyltransferase (HAT) enzymes known previously to be mutated in lymphoma (for example, *EZH2* (ref. 13) and *CREBBP* (ref. 15); Supplementary Methods).

Mutation hot spots can result from mutations at sites under strong selective pressure and we have previously identified such sites using RNA-seq data¹⁵. We searched our RNA-seq data for genes with mutation hot spots, and identified 10 genes that were not mutated in the 14 genomes (*PIM1*, *FOXO1*, *CCND3*, *TP53*, *IRF4*, *BTG2*, *CD79B*, *BCL7A*, *IKZF3* and *B2M*), of which five (*FOXO1*, *CCND3*, *BTG2*,

IKZF3 and *B2M*) were not previously known targets of point mutation in NHL (Supplementary Table 6 and Supplementary Methods). *FOXO1*, *BCL7A* and *B2M* had hot spots affecting their start codons. The effect of a *FOXO1* start codon mutation, which was observed in three cases, was further studied using a cell line in which the initiating ATG was mutated to TTG. Western blots probed with a *FOXO1* antibody revealed a band with a reduced molecular weight, indicative of a *FOXO1* amino-terminal truncation (Supplementary Figure 2), consistent with use of the next in-frame ATG for translation initiation. A second hot spot in *FOXO1* at T24 was mutated in two cases. T24 is reportedly phosphorylated by AKT subsequent to B-cell receptor (BCR) stimulation¹⁶ inducing *FOXO1* nuclear export.

We analysed the RNA-seq data to determine whether any of the somatic mutations in the 109 recurrently mutated genes showed evidence for allelic imbalance with expression favouring one allele. Out of 380 expressed heterozygous mutant alleles, we observed preferential expression of the mutation for 16.8% (64/380) and preferential expression of the wild type for 27.8% (106/380; Supplementary Table 7). Seven genes showed evidence for significant preferential expression of the mutant allele in at least two cases: *BCL2*, *CARD11*, *CD79B*, *EZH2*, *IRF4*, *MEF2B* and *TP53*; Supplementary Methods. In 27 out of 43 cases with *BCL2* cSNVs, expression favoured the mutant allele, consistent with the previously-described hypothesis that the translocated (and hence, transcriptionally deregulated) allele of *BCL2* is targeted by somatic hypermutation¹⁷. Examples of mutations at known oncogenic hot spot sites such as F123I in *CARD11* (ref. 18) showed allelic imbalance favouring the mutant allele in some cases. Similarly, we noted expression favouring two novel hot spot mutations in *MEF2B* (Y69 and D83) and two sites in *EZH2* not previously reported as mutated in lymphoma (A682G and A692V).

We sought to distinguish new cancer-related mutations from passenger mutations using the approach proposed previously¹⁹. We reasoned that this would reveal genes with strong selection signatures, and mutations in such genes would be good candidate cancer drivers. We identified 26 genes with significant evidence for positive selection (false discovery rate = 0.03, Supplementary Methods), with either selective pressure for acquiring non-synonymous point mutations or truncating/nonsense mutations (Supplementary Methods; Table 1 and Supplementary Table 8). Included were known lymphoma oncogenes (*BCL2*, *CD79B* (ref. 9), *CARD11* (ref. 18), *MYD88* (ref. 10) and *EZH2* (ref. 13)), all of which showed signatures indicative of selection for non-synonymous variants.

Evidence for selection of inactivating changes

We expected tumour suppressor genes to show strong selection for the acquisition of nonsense mutations. In our analysis, the eight most significant genes included seven with strong selective pressure for nonsense mutations, including the known tumour suppressor genes *TP53* and *TNFRSF14* (ref. 20; Table 1). *CREBBP*, recently reported as commonly inactivated in DLBCL¹⁵, also showed some evidence for acquisition of nonsense mutations and cSNVs (Supplementary Figure 3 and Supplementary Table 9). We also observed enrichment for nonsense mutations in *BCL10*, a positive regulator of NF- κ B, in which oncogenic truncated products have been described in lymphomas²¹. The remaining strongly significant genes (*BTG1*, *GNA13*, *SGK1* and *MLL2*) had no reported role in lymphoma. *GNA13* was affected by mutations in 22 cases including multiple nonsense mutations. *GNA13* encodes the alpha subunit of a heterotrimeric G-protein coupled receptor responsible for modulating RhoA activity²². Some of the mutated residues negatively affect its function^{23,24}, including a T203A mutation, which also showed allelic imbalance favouring the mutant allele (Supplementary Table 7). *GNA13* protein was reduced or absent on western blots in cell lines harbouring either a nonsense mutation, a stop codon deletion, a frame shifting deletion, or changes affecting splice sites (Supplementary Methods and Supplementary Figure 4).

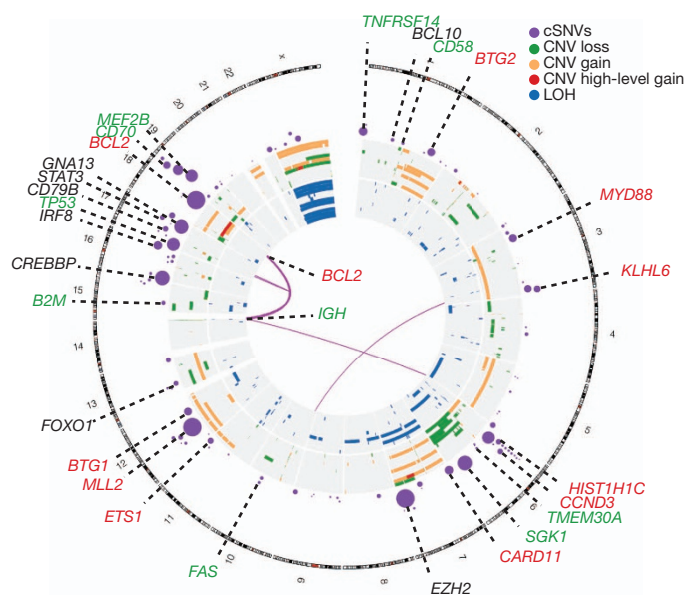


Figure 1 | Genome-wide visualization of somatic mutation targets in NHL. Overview of structural rearrangements and copy number variations (CNVs) in the 11 DLBCL genomes and cSNVs in the 109 recurrently mutated genes identified in our analysis. Inner arcs represent somatic fusion transcripts identified in at least one of the 11 genomes. The CNVs and LOH detected in each of the 11 DLBCL tumour/normal pairs are displayed on the concentric sets of rings. The inner 11 rings show regions of enhanced homozygosity plotted with blue (interpreted as LOH). The outer 11 rings show somatic CNVs. Purple circles indicate the position of genes with at least two confirmed somatic mutations with circle diameter proportional to the number of cases with cSNVs detected in that gene. Circles representing the genes with significant evidence for positive selection are labelled. Coincidence between recurrently mutated genes and regions of gain/loss are colour-coded in the labels (green, loss; red, gain). For example *B2M*, which encodes beta-2-microglobulin, is recurrently mutated and is deleted in two cases.

Table 1 | Overview of cSNVs and confirmed somatic mutations in most frequently mutated genes

Gene	Cases			Total			Somatic cSNVs (RNA-seq cohort)*	<i>P</i> (raw)	<i>q</i>	NS SP	T SP	Skew (M, WT, both)†
	NS	S	T	NS	S	T						
<i>MLL2</i> ‡	16	8	17	17	8	18	10	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	0.834	14.4	WT
<i>TNFRSF14</i> G‡	7	1	7	8	1	7	11	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	7.52	118	Both
<i>SGK1</i> G‡	18	6	6	37	10	6	9	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	19.5	61.7	–
<i>BCL10</i> ‡	2	0	4	3	0	4	4	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	3.62	112	WT
<i>GNAI3</i> G‡	21	1	2	33	1	2	5	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	24.1	25.7	Both
<i>TP53</i> G‡	20	2	1	23	3	1	22	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	15.6	14.1	Both
<i>EZH2</i> G‡	33	0	0	33	0	0	33	6.85 × 10⁻⁸	8.50 × 10 ⁻⁷	11.4	0.00	Both
<i>BTG2</i> ‡	12	6	1	14	6	1	2	6.85 × 10 ⁻⁸	8.50 × 10 ⁻⁷	23.9	35.1	–
<i>BCL2</i> G‡	42	45	0	96	105	0	43	9.35 × 10⁻⁸	8.50 × 10 ⁻⁷	3.78	0.00	M
<i>BCL6</i> ‡§	11	2	0	12	2	0	2	9.35 × 10⁻⁸	8.50 × 10 ⁻⁷	0.175	0.00	M
<i>CIITA</i> ‡§	5	3	0	6	3	0	2	9.35 × 10⁻⁸	8.50 × 10 ⁻⁷	0.086	0.00	–
<i>FAS</i> ‡	2	0	4	3	0	4	2	1.52 × 10 ⁻⁷	1.17 × 10 ⁻⁶	2.54	66.5	WT
<i>BTG1</i> ‡	11	6	2	11	7	2	10	1.52 × 10 ⁻⁷	1.17 × 10 ⁻⁶	17.5	52.5	Both
<i>MEF2B</i> G‡	20	2	0	20	2	0	10	2.05 × 10 ⁻⁷	1.47 × 10 ⁻⁶	14.2	0.00	M
<i>IRF8</i> ‡	11	5	3	14	5	3	3	4.55 × 10 ⁻⁷	3.03 × 10 ⁻⁶	8.82	28.2	WT
<i>TMEM30A</i> ‡	1	0	4	1	0	4	4	6.06 × 10 ⁻⁷	3.79 × 10 ⁻⁶	0.785	65.0	WT
<i>CD58</i> ‡	2	0	3	2	0	3	2	2.42 × 10 ⁻⁶	1.43 × 10 ⁻⁵	2.29	69.2	–
<i>KLHL6</i> ‡	10	2	2	12	2	2	4	1.00 × 10 ⁻⁵	5.26 × 10 ⁻⁵	5.42	16.4	–
<i>MYD88</i> A‡	13	2	0	14	2	0	9	1.00 × 10 ⁻⁵	5.26 × 10 ⁻⁵	12.4	0.00	WT
<i>CD70</i> ‡	5	0	1	5	0	2	3	1.70 × 10 ⁻⁵	8.48 × 10 ⁻⁵	7.08	44.0	–
<i>CD79B</i> A‡	7	2	1	9	2	1	5	2.00 × 10 ⁻⁵	9.52 × 10 ⁻⁵	10.9	18.3	M
<i>CCND3</i> ‡	7	1	2	7	1	2	6	2.80 × 10 ⁻⁵	1.27 × 10 ⁻⁴	6.55	36.3	WT
<i>CREBBP</i> ‡	20	7	4	24	7	4	9	1.00 × 10 ⁻⁴	4.35 × 10 ⁻⁴	2.72	6.04	Both
<i>HIST1H1C</i> ‡	9	0	0	10	0	0	6	1.80 × 10 ⁻⁴	7.50 × 10 ⁻⁴	11.9	0.00	Both
<i>B2M</i> ‡	7	0	0	7	0	0	4	3.90 × 10 ⁻⁴	1.56 × 10 ⁻³	16.6	0.00	WT
<i>ETS1</i> ‡	10	1	0	10	1	0	4	4.10 × 10 ⁻⁴	1.58 × 10 ⁻³	5.76	0.00	WT
<i>CARD11</i> ‡	14	3	0	14	3	0	3	1.90 × 10 ⁻³	7.04 × 10 ⁻³	3.37	0.00	Both
<i>FAT2</i> ‡§	2	1	0	2	1	0	2	6.30 × 10 ⁻³	2.25 × 10 ⁻²	0.128	0.00	–
<i>IRF4</i> ‡§	9	4	0	26	5	0	5	7.00 × 10 ⁻³	2.41 × 10 ⁻²	0.569	0.00	Both
<i>FOXO1</i> ‡	8	4	0	10	4	0	4	7.60 × 10 ⁻³	2.53 × 10 ⁻²	4.02	0.00	–
<i>STAT3</i>	9	0	0	9	0	0	4	2.19 × 10 ⁻²	6.08 × 10 ⁻²	–	–	Both
<i>RAPGEF1</i>	8	3	0	10	3	0	3	2.98 × 10 ⁻²	7.45 × 10 ⁻²	–	–	WT
<i>ABCA7</i>	12	3	0	15	3	0	2	7.76 × 10 ⁻²	1.67 × 10 ⁻¹	–	–	WT
<i>RNF213</i>	10	8	0	10	8	0	2	7.87 × 10 ⁻²	1.67 × 10 ⁻¹	–	–	–
<i>MUC16</i>	17	12	0	39	25	0	2	8.32 × 10 ⁻²	1.73 × 10 ⁻¹	–	–	–
<i>HDAC7</i>	8	4	0	8	4	0	2	8.94 × 10 ⁻²	1.82 × 10 ⁻¹	–	–	WT
<i>PRKDC</i>	7	3	0	7	4	0	2	1.06 × 10 ⁻¹	2.05 × 10 ⁻¹	–	–	–
<i>SAMD9</i>	9	2	0	9	2	0	2	1.79 × 10 ⁻¹	3.01 × 10 ⁻¹	–	–	–
<i>TAF1</i>	10	0	0	10	0	0	2	3.03 × 10 ⁻¹	4.74 × 10 ⁻¹	–	–	–
<i>PIM1</i>	20	19	0	33	34	0	11	3.40 × 10 ⁻¹	5.23 × 10 ⁻¹	–	–	WT
<i>COL4A2</i>	8	2	0	8	2	0	2	7.64 × 10 ⁻¹	8.99 × 10 ⁻¹	–	–	–
<i>EP300</i>	8	7	1	8	7	1	3	9.54 × 10 ⁻¹	1.00	–	–	WT

Individual cases with non-synonymous (NS), synonymous (S) and truncating (T) mutations and the total number of mutations of each class are shown separately because some genes contained multiple mutations in the same case. The *P* values indicated in bold are the upper limit on the *P* value for that gene determined with the approach described in ref. 19 (see Supplementary Methods), *q* is the Benjamini-corrected *q* value, and NS SP and T SP refer to selective pressure estimates from this model for the acquisition of non-synonymous or truncating mutations, respectively. Genes with a superscript of either A or G were found to have mutations significantly enriched in ABC or GCB cases, respectively (*P* < 0.05, Fisher's exact test).

*Additional somatic mutations identified in larger cohorts and insertion/deletion mutations are not included in this total.

† 'Both' indicates that we observed separate cases in which skewed expression was seen but where this skew was not consistent for the mutant or wild-type allele.

‡ Genes significant at a false discovery rate of 0.03. SNVs in *BCL2* and previously confirmed hot spot mutations in *EZH2* and *CD79B* are probably somatic in these samples based on published observations of others.

§ Selective pressure estimates are both < 1 indicating purifying selection rather than positive selection acting on this gene.

SGK1 encodes a phosphatidylinositol-3-OH kinase (PI(3)K)-regulated kinase with functions including regulation of FOXO transcription factors²⁵, regulation of NF-κB by phosphorylating IκB kinase²⁶, and negative regulation of NOTCH signalling²⁷. *SGK1* also resides within a region of chromosome 6 commonly deleted in DLBCL (Fig. 1)⁵. The mechanism by which *SGK1* and *GNAI3* inactivation may contribute to lymphoma is unclear, but the strong degree of apparent selection towards their inactivation and their overall high mutation frequency (each mutated in 18 of 106 DLBCL cases) suggests that their loss contributes to B-cell NHL. Certain genes are known to be mutated more commonly in GCB DLBCLs (for example, *TP53* (ref. 28) and *EZH2* (ref. 13)). Here, both *SGK1* and *GNAI3* mutations were found only in GCB cases (*P* = 1.93 × 10⁻³ and 2.28 × 10⁻⁴, Fisher's exact test; *n* = 15 and 18, respectively) (Fig. 2). Two additional genes (*MEF2B* and *TNFRSF14*) with no previously described role in DLBCL showed a similar restriction to GCB cases (Fig. 2).

Inactivating *MLL2* mutations

MLL2 showed the most significant evidence for selection and the largest number of nonsense SNVs. Our RNA-seq analysis indicated that 26.0% (33/127) of cases carried at least one *MLL2* cSNV. To

address the possibility that variable RNA-seq coverage of *MLL2* failed to capture some mutations, we PCR-amplified the entire *MLL2* locus (~36 kilobases) in 89 cases (35 primary FLs, 17 DLBCL cell lines, and 37 DLBCLs). Of these cases 58 were among the RNA-seq cohort. Illumina amplicon re-sequencing (Supplementary Methods) revealed 78 mutations, confirming the RNA-seq mutations in the overlapping cases and identifying 33 additional mutations. We confirmed the somatic status of 46 variants using Sanger sequencing (Supplementary Table 10), and showed that 20 of the 33 additional mutations were insertions or deletions (indels). Three SNVs at splice sites were also detected, as were 10 new cSNVs that had not been detected by RNA-seq.

The somatic mutations were distributed across *MLL2* (Fig. 3a). Of these, 37% (*n* = 29/78) were nonsense mutations, 46% (*n* = 36/78) were indels that altered the reading frame, 8% (*n* = 6/78) were point mutations at splice sites and 9% (*n* = 7/78) were non-synonymous amino acid substitutions (Table 2). Four of the somatic splice site mutations had effects on *MLL2* transcript length and structure. For example, two heterozygous splice site mutations resulted in the use of a novel splice donor site and an intron retention event.

Approximately half of the NHL cases we sequenced had two *MLL2* mutations (Supplementary Table 10). We used bacterial artificial

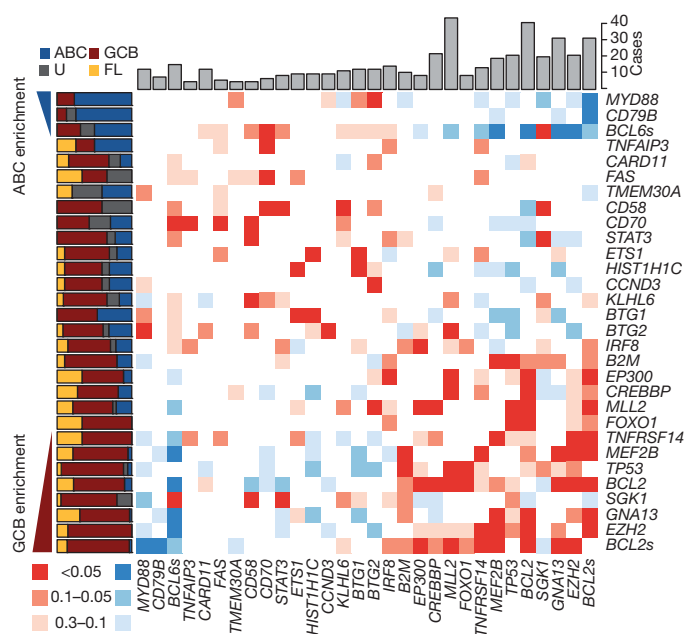


Figure 2 | Overview of mutations and potential cooperative interactions in NHL. This heat map displays possible trends towards co-occurrence (red) and mutual exclusion (blue) of somatic mutations and structural rearrangements. Colours were assigned by taking the minimum value of a left- and right-tailed Fisher's exact test. To capture trends a P -value threshold of 0.3 was used, with the darkest shade of the colour indicating those meeting statistical significance ($P \leq 0.05$). The relative frequency of mutations in ABC (blue), GCB (red), unclassifiable (black) DLBCLs and FL (yellow) cases is shown on the left. Genes were arranged with those having significant ($P < 0.05$, Fisher's exact test) enrichment for mutations in ABC cases (blue triangle) towards the top (and left) and those with significant enrichment for mutations in GCB cases (red triangle) towards the bottom (and right). The total number of cases in which each gene contained either cSNVs or confirmed somatic mutations is shown at the top. The cluster of blue squares (upper-right) results from the mutual exclusion of the ABC-enriched mutations (for example, *MYD88*, *CD79B*) from the GCB-enriched mutations (for example, *EZH2*, *GNA13*). Presence of structural rearrangements involving the two oncogenes *BCL6* and *BCL2* (indicated as *BCL6s* and *BCL2s*) was determined with FISH techniques using break-apart probes (Supplementary Methods).

chromosome (BAC) clone sequencing in eight FL cases to show that in all eight cases the mutations were in *trans*, affecting both *MLL2* alleles. This observation is consistent with the notion that there is a complete, or near-complete, loss of *MLL2* in the tumour cells of such patients.

With the exception of two primary FL cases and two DLBCL cell lines (Pfeiffer and SU-DHL-9), the majority of *MLL2* mutations seemed to be heterozygous. Analysis of Affymetrix 500k SNP array data from two FL cases with apparent homozygous mutations revealed that both tumours showed copy number neutral loss of heterozygosity (LOH) for the region of chromosome 12 containing *MLL2* (Supplementary Methods). Thus, in addition to bi-allelic mutation, LOH is a second, albeit less common mechanism by which *MLL2* function is lost.

MLL2 was the most frequently mutated gene in FL, and among the most frequently mutated genes in DLBCL (Fig. 2). We confirmed *MLL2* mutations in 31 of 35 FL patients (89%), in 12 of 37 DLBCL patients (32%), in 10 of 17 DLBCL cell lines (59%) and in none of the eight normal centroblast samples we sequenced. Our analysis predicted that the majority of the somatic mutations observed in *MLL2* were inactivating (91% disrupted the reading frame or were truncating point mutations), indicating to us that *MLL2* is a tumour suppressor of significance in NHL.

Recurrent point mutations in *MEF2B*

Our selective pressure analysis also revealed genes with stronger pressure for acquisition of amino acid substitutions than for nonsense

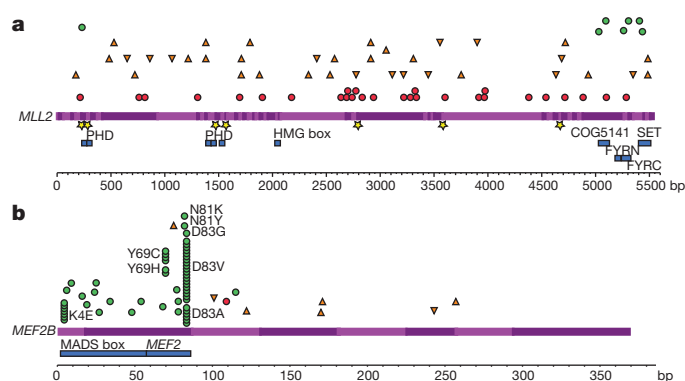


Figure 3 | Summary and effect of somatic mutations affecting *MLL2* and *MEF2B*. **a**, Re-sequencing the *MLL2* locus in 89 samples revealed mainly nonsense (red circles) and frameshift-inducing indel mutations (orange triangles; inverted triangles for insertions and upright triangles for deletions). A smaller number of non-synonymous somatic mutations (green circles) and point mutations or deletions affecting splice sites (yellow stars) were also observed. All of the non-synonymous point mutations affected a residue within either the catalytic SET domain, the FYRC domain (FY-rich carboxy-terminal domain) or PHD zinc finger domains. The effect of these splice-site mutations on *MLL2* splicing was also explored (Supplementary Figure 7). **b**, The cSNVs and somatic mutations found in *MEF2B* in all FL and DLBCL cases sequenced are shown with the same symbols. Only the amino acids with variants in at least two patients are labelled. cSNVs were most prevalent in the first two protein-coding exons of *MEF2B* (exons 2 and 3). The crystal structure of *MEF2* bound to EP300 supports the idea that two of the mutated sites (L67 and Y69) are important in the interaction between these proteins (Supplementary Figure 8 and Supplementary Discussion)⁵⁰.

mutations. One such gene was *MEF2B*, which had not previously been linked to lymphoma. We found that 20 (15.7%) cases had *MEF2B* cSNVs and 4 (3.1%) cases had *MEF2C* cSNVs. All cSNVs detected by RNA-seq affected either the MADS box or *MEF2* domains. To determine the frequency and scope of *MEF2B* mutations, we Sanger-sequenced exons 2 and 3 in 261 primary FL samples; 259 DLBCL primary tumours; 17 cell lines; 35 cases of assorted NHL (IBL, composite FL and PBMCL); and eight non-malignant centroblast samples. We also used a capture strategy (Supplementary Methods) to sequence the entire *MEF2B* coding region in the 261 FL samples, revealing six additional variants outside exons 2 and 3. We thus identified 69 cases (34 DLBCL, 12.67%; and 35 FL, 15.33%) with *MEF2B* cSNVs or indels, failing to observe novel variants in other NHL and non-malignant samples. Of the variants 55 (80%) affected residues within the MADS box and *MEF2* domains encoded by exons 2 and 3 (Supplementary Table 11; Fig. 3b). Each patient generally had a single *MEF2B* variant and we observed relatively few (eight in total, 10.7%) truncation-inducing SNVs or indels. Non-synonymous SNVs were by far the most common type of change observed, with 59.4% of detected variants affecting K4, Y69, N81 or D83. In 12 cases *MEF2B* mutations were shown to be somatic, including representative mutations at each of K4, Y69, N81 and D83 (Supplementary Table 12). We did not detect mutations in ABC cases, indicating that somatic mutations in *MEF2B* have a role unique to the development of GCB DLBCL and FL (Fig. 2).

Table 2 | Summary of types of *MLL2* somatic mutations

Sample Type	FL	DLBCL	DLBCL cell-line	Centroblast
Truncation	18	4	7	0
Indel with frameshift	22	8	6	0
Splice site	4	2	0	0
SNV	3	2	2	0
Any mutation/ number of cases	31/35	12/37	10/17	0/8
Percentage	89	32	59	0

Discussion

In our study of genome, transcriptome and exome sequences from 127 B-cell NHL cases, we identified 109 genes with clear evidence of somatic mutation in multiple individuals. Significant selection seems to act on at least 26 of these for the acquisition of either nonsense or missense mutations. To the best of our knowledge, the majority of these genes had not previously been associated with any cancer type. We observed an enrichment of somatic mutations affecting genes involved in transcriptional regulation and, more specifically, chromatin modification.

MLL2 emerged from our analysis as a major tumour suppressor locus in NHL. It is one of six human H3K4-specific methyltransferases²⁹, all of which share homology with the *Drosophila* trithorax gene. Trimethylated H3K4 (H3K4me3) is an epigenetic mark associated with the promoters of actively transcribed genes. By laying down this mark, MLLs are responsible for the transcriptional regulation of developmental genes including the homeobox (*Hox*) gene family³⁰ which collectively control segment specificity and cell fate in the developing embryo^{31,32}. Each MLL family member is thought to target different subsets of *Hox* genes³³ and in addition, *MLL2* is known to regulate the transcription of a diverse set of genes³⁴. Recently, *MLL2* mutations were reported in a small-cell lung cancer cell line³⁵ and in renal carcinoma³⁶, but the frequency of nonsense mutations affecting *MLL2* in these cancers was not established in these reports. Inactivating mutations were reported recently in *MLL2* or *MLL3* in 16% of medulloblastoma patients³⁷, further implicating *MLL2* as a cancer gene.

Our data link *MLL2* somatic mutations to B-cell NHL. The reported mutations are likely to be inactivating and in eight of the cases with multiple mutations, we confirmed that both alleles were affected, presumably resulting in essentially complete loss of *MLL2* function. The high prevalence of *MLL2* mutations in FL (89%) equals the frequency of the t(14;18)(q32;q21) translocation, which is considered the most prevalent genetic abnormality in FL³. In DLBCL tumour samples and cell lines, *MLL2* mutation frequencies were 32% and 59%, respectively, also exceeding the prevalence of the most frequent cytogenetic abnormalities, such as the various translocations involving 3q27, which occur in 25–30% of DLBCLs and are enriched in ABC cases³⁸. Importantly, we found *MLL2* mutated in both DLBCL subtypes (Fig. 2). Our analyses thus indicate that *MLL2* acts as a central tumour suppressor in FL and both DLBCL subtypes.

The *MEF2* gene family encodes four related transcription factors that recruit histone-modifying enzymes including histone deacetylases (HDACs) and HATs in a calcium-regulated manner. Although truncating variants were detected in our analysis of *MEF2* gene family members, our analysis suggests that, in contrast to *MLL2*, *MEF2* family members tend to selectively acquire non-synonymous amino acid substitutions. In the case of *MEF2B*, 59.4% of all the cSNVs were found at four sites within the protein (K4, Y69, N81 and D83), and all four of these sites were confirmed to be targets of somatic mutation. D83 is affected in 39% of the *MEF2B* alterations, resulting in replacement of the charged aspartate with any of alanine, glycine or valine. Although we cannot yet predict the consequences of these substitutions on protein function, it seems likely that their effect would have an impact on the ability of *MEF2B* to facilitate gene expression and thus have a role in promoting the malignant transformation of germinal centre B cells to lymphoma (Supplementary Discussion).

MEF2B mutations can be linked to *CREBBP* and *EP300* mutations, and to recurrent Y641 mutations in *EZH2* (ref. 13). One target of *CREBBP/EP300* HAT activity is H3K27, which is methylated by *EZH2* to repress transcription. There is evidence that the action of *EZH2* antagonizes that of *CREBBP/EP300* (ref. 39). One function of *MEF2* is to recruit either HDACs or *CREBBP/EP300* to target genes⁴⁰, and it has been suggested that HDACs compete with *CREBBP/EP300* for the same binding site on *MEF2* (ref. 41). Under normal Ca²⁺ levels, *MEF2* is bound by type IIa HDACs, which maintain the tails

of histone proteins in a deacetylated repressive chromatin state⁴². Increased cytoplasmic Ca²⁺ levels induce the nuclear export of HDACs, enabling the recruitment of HATs such as *CREBBP/EP300*, facilitating transcription at *MEF2* target genes. Mutation of *CREBBP*, *EP300* or *MEF2B* may have an impact on the expression of *MEF2* target genes owing to reduced acetylation of nucleosomes near these genes (Supplementary Figure 5; Supplementary Discussion). In light of the recent finding that heterozygous *EZH2* Y641 mutations enhance overall H3K27 trimethylation activity of PRC2 (refs 43, 44), it is possible that mutation of both *MLL2* and *EZH2* could cooperate in reducing the expression of some of the same target genes. Our data indicate that (1) post-transcriptional modification of histones is of key importance in germinal centre B cells and (2) deregulated histone modification due to these mutations is likely to result in reduced acetylation and enhanced methylation, and acts as a core driver event in the development of NHL (Supplementary Figure 5).

METHODS SUMMARY

All samples analysed contained at least 50% tumour cells. Genomes, exomes and transcriptomes were sequenced using a combination of Illumina GAIIx and HiSeq 2000 instruments to read lengths of between 36 and 100 nucleotides. Exome capture was performed using the Agilent SureSelect Target Enrichment System Protocol (Version 1.0, September 2009). Alignment was accomplished using BWA⁴⁵ and variants were identified using SNVMix⁴⁶. Variants were manually reviewed in IGV and were confirmed (where applicable) by PCR followed by either Sanger sequencing or Illumina re-sequencing. Structural rearrangements in genomes and transcriptomes were identified using ABySS⁴⁷. Gene expression values used for subtype assignment were calculated as reads per kilobase gene model per million mapped reads (RPKM) values⁴⁸ and subtypes were assigned using an adaptation of the method developed for data from Affymetrix expression arrays⁴⁹ trained with samples previously classified by this standard approach.

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Supplementary Information is linked to the online version of the paper at www.nature.com/nature.

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