Supplementary Appendix

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Whole Genome DNA and Transcriptome Library Preparation

The BL cases comprised both formalin fixed paraffin embedded (FFPE, N= 65) and freshly frozen cases (N=36). Whole genome libraries were prepared using the KAPA HyperPrep kit. RNA libraries were prepared using the KAPA Stranded RNA-Seq Library Prep kit.

We¹ and others² have previously established the feasibility of next generation DNA and RNA sequencing in FFPE cases. We also carefully compared the mutational rates from FFPE and frozen cases and found them to be similar.

Approximately 50-300ng of DNA was enzymatically fragmented for 10-30 minutes using dsDNA Fragmentase (NEB, Ipswich, MA). Libraries were prepared using the KAPA Hyper Prep kit (Roche, Wilmington, MA) according to the manufacturer's specifications. Subsequent libraries were PCR amplified using 6 to 12 cycles of PCR, depending on available input. Subsequent whole genome libraries were sequenced on the Illumina TenX platform, 150 paired end.

100-1000 ng of total RNA was subjected to ribosomal depletion by hybridization, RNase H and DNase I digestion (NEB, Ipswich, MA) and bead purification. Library preparation was performed using the KAPA Stranded RNA-Seq Library Prep kit according to the manufacturer's specifications (Roche, Wilmington, MA). Multiplexed capture was performed on up to 24 RNA libraries using the SureSelectXT All Exon V6 + UTR bait set, according to the manufacturer's specifications (Agilent, Santa Clara, CA). Subsequent libraries were sequenced on the Illumina Hiseq 2500 V4 platform, 50 paired end.

EBV Identification

We obtained the unaligned read pairs from the tumor and normal samples and performed Diamond BLASTX on the Non-redundant (NR) protein sequences database. The output format of Diamond alignment was set for taxonomic classification ("-f 102"). Samples were considered EBV-positive if at least 5,000 reads or >10% of unmapped reads were classified as *Lymphocryptovirus* at the genus level (NCBI tax ids: 10375, 10376, 10377). EBV status calls were not made for samples with fewer than 10,000 input unmapped reads.

EBV subtype calls were made for EBV+ samples by determining the proportion of Type-1 (B95-8) vs. type-2 EBNA-2 (AG876) sequences among unmapped reads. Briefly, representative nucleotide sequences were downloaded in FASTA format from UniProt (Type 1: P12978, Type 2: Q69022). As above, reads were aligned to a custom diamond database containing only representative sequences from each EBV subtype (diamond makedb -in <ebna2.fa>) with the option –max-target-seqs set to 1 to return only the top alignment. Alignments were filtered to include only significant hits which were defined as >35 amino acids in length, >50% amino acid identity, and with a maximum e-value of 1.0e-5. After filtering, a custom R-script was then used to determine the number of reads in each sample mapping to each EBNA-2 gene variant. A subtype call was made if >99% of reads mapping to EBNA-2 mapped to a single subtype. All cases were verified using in situ hybridization for EBER where material was available.

CRISPR Screening

Lentiviral particles were transduced into each cell line in triplicate, and harvested 3 days post transduction (early) and 3 weeks post transduction (late). In each case, DNA was isolated and targeted sequencing of the guide RNA sequences was performed.

High throughput Illumina sequencing of sgRNA libraries amplified from plasmid sequences was used to determine sgRNA abundance for populations at each time-point. The median raw sequencing depth across sequencing libraries was 33,951,761 reads corresponding to 282 reads/sgRNA for a given library. sgRNA preprocessing, QC, quantification and computing gene knockout scores was performed similar to our previous publication¹. Subsequent sgRNA abundance was assessed and compared between the two time points. Highly abundant sgRNAs were predicted to target tumor suppressor genes, whereas less abundant sgRNAs were predicted oncogenic.

Identification of essential BL genes

The effects of gene knockout were considered significant for a cell line if the probability of observing a larger difference in the mean sgRNA counts between early and late time points was <0.05 (after correcting for multiple comparisons) and the CRISPR gene score for that gene was >1 or <-1. For each gene in each cell line, a paired Mann-Whitney U test was used to determine whether the normalized sgRNA counts observed in early and late time points was significantly larger than would be expected from chance alone ($\alpha = 0.05$). Early and late sgRNA counts of the same sgRNA from the same replicate population were considered as pairs. Normalized sgRNA counts were log-transformed (log2 [1 + sgRNA count]) prior to significance testing to minimize the effects of outliers. Additionally, p-values were corrected for multiple comparisons using the FDR method as implemented in the R statistical environment (p.adjust). A similar method was used to determine whether gene knockout resulted in a significant effect at the disease level. Genes were considered significant at the pan-Burkitt level if a significant effect was observed when replicates from multiple cell lines (BJAB, BL41, Jijoye) were considered as a single cell line and assessed for significance using paired Mann-Whitney U tests as above. A similar method was used to identify pan-DLBCL genes from DLBCL cell lines (HBL1, Ly3, SUDHL4). BL- and DLBCL-specific essential genes were identified by removing genes which had a significant effect in at least one cell line from each disease.

ID3 Affinity Purification, Mass Spectrometry and Protein Identification ID3-FLAG was constructed by cloning *ID3* into the HindIII and BamHI sites in pLFLAG-N1; FLAG-ID3 was constructed by cloning *ID3* into the BgIII and HindIII sites in pLFLAG-C1. Constructs were confirmed by Sanger sequencing. Subsequent constructs were packaged into retrovirus and transduced into cell lines. Overexpression of ID3-Flag in BJAB cells was confirmed by Western blot. Cells stably expressing FLAG-ID3 were lysed in 1% Triton X-100 lysis buffer, then incubated with FLAG resin, rotating at 4 °C for 1 hour. An on-bead digest was performed using trypsin (Promega, Madison, WI) and the FASP Protein Digestion Kit (Protein Discovery) at 37 °C overnight (16 hours). Eluted peptides were cleaned up with a C18 spin column (Peirce, Waltham, MA) and 3 ethyl acetate washes. To perform LC-MS, a reverse phase nano-HPLC using a nanoAquity UPLC system (Waters Corp., Milfor, MA) and Orbitrap fusion lumos mass spectrometer was utilized to perform mass spectral analysis. The raw mass spectrometry data was searched with MaxQuant.

Gene Editing by CRISPR

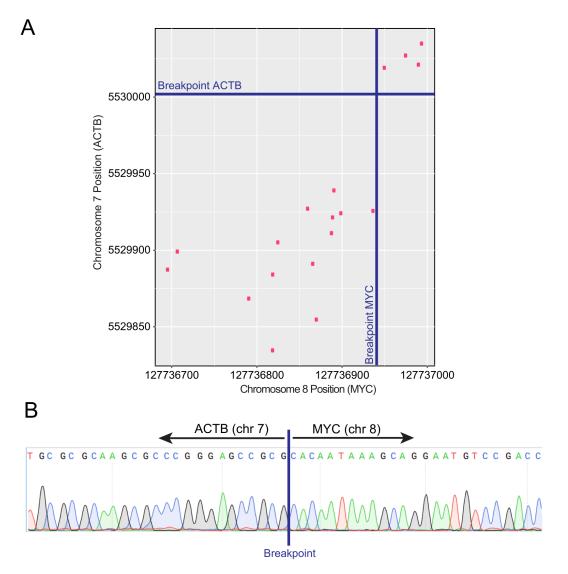
Guide RNA sequences were chosen targeting the helix loop helix region of the *ID3* and *TCF4* genes using the MIT CRISPR Design tool (http://crispr.mit.edu/) and designed for BbsI digestion. sgRNAs were annealed using T4 PNK, digested alongside pSpCas9 (BB)-2A-GFP (pX458) (Addgene, Plasmid #48138) using the BbsI, and ligated using T4 DNA ligase (NEB, Ipswich, MA). Constructs were transformed into ElectroMAXTM DH5 α -ETM Cells (ThermoFisher Scientific, 11319019) and colonies confirmed for vector + insert by Sanger. Constructs were nucleofected into cell lines using the Amaxa Electroporator (Lonza, Basel, Switzerland). Cells were harvested and mixed with Nucleofector solution, 22% Supplement 1 (Cell Line Nucleofector® Kit V) containing 1 µg of vector. Cells single cell sorted based on GFP positivity. Clones were expanded for 3 weeks, and subsequent deletions in the *ID3* and *TCF4* genes were confirmed by Sanger sequencing.

BrdU Staining and Flow Cytometry Analysis

Approximately 5 x 10⁵ cells were harvested and processed using reagents from the FITC BrdU Kit (Biolegend, San Diego, CA) according to the manufacturer's guidelines. Briefly, cells were subject to BrdU incorporation for 6 hours. Cells were in Cytofix/Cytoperm and DNase treated for 30 minutes followed by stained with FITC-anti-BrdU and 7-AAD. Samples were analyzed using a Sony flow cytometer machine (Sony Biotechnologies, SH800) with proper compensation for dual color analysis. Flowjo software was used to analyze the final data.

Validation of novel translocation t(8,7) - MYC and ACTB

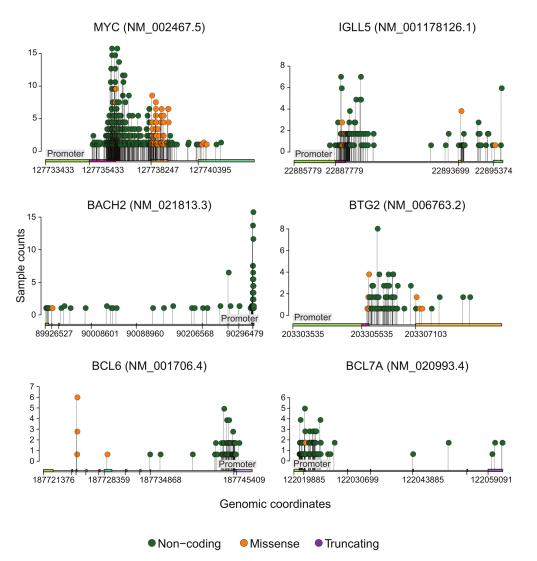
Through clustering discordant reads (i.e. read pairs whose mates map on different chromosomes), we identified a novel translocation between *MYC* (chr8) and *ACTB* (chr7) (**Figure S1A**). We used density based spectral clustering³ to cluster the discordant reads using a Euclidean distance metric (max distance of 300 bases). The breakpoints were identified using chimeric reads in *MYC* and *ACTB* genes. We then validated the presence of this translocation using Sanger sequencing around the breakpoint region (**Figure S1B**).



Supplementary Figure S1: Validation of translocation t(8,7) - MYC and ACTB (A) Scatter plot shows discordant reads that support the translocation, with breakpoints shown as a blue line. (B) Sanger sequencing plot shows ± 25 base pairs around the breakpoint region (shown as a blue line).

Distribution of somatic variants in driver genes

Variant stem plots for the top mutated driver genes with a high proportion of non-coding variants are shown in **Figure S2**. These plots show an enrichment of non-coding variants in the driver genes and highlight the importance of studying whole genomes in Burkitt lymphoma. Variants are plotted across the genomic coordinates (x-axis) with their height showing the number of mutated Burkitt lymphoma samples⁴. The variants are colored based on their functional annotation (missense, truncating or non-coding). The colored bars along the x-axis show the promoter and the exons.

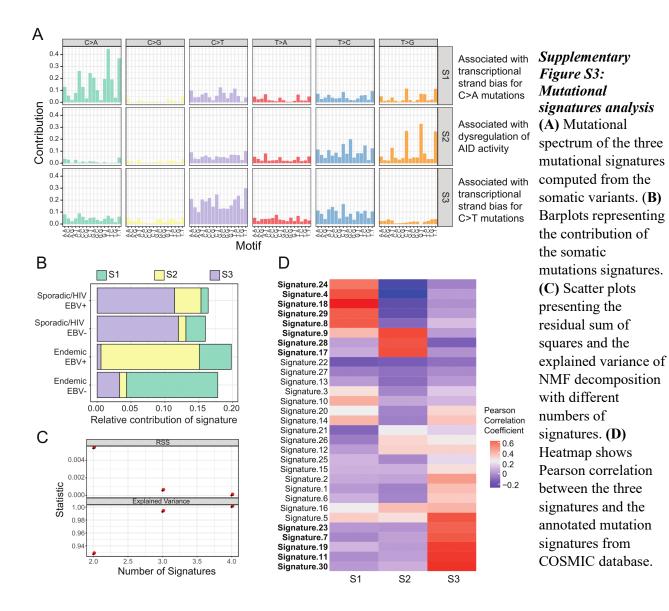


Supplementary Figure S2: Distribution of somatic variants in driver genes

Variant-stem plots for selected driver genes show the distribution of somatic variants across the genomic coordinates on the x-axis and sample counts for each of the variants on the y-axis. The colored bars on the x-axis show the promoter and the exons. The promoter regions are also labeled. Variants are colored based on their function.

Mutational signatures analysis

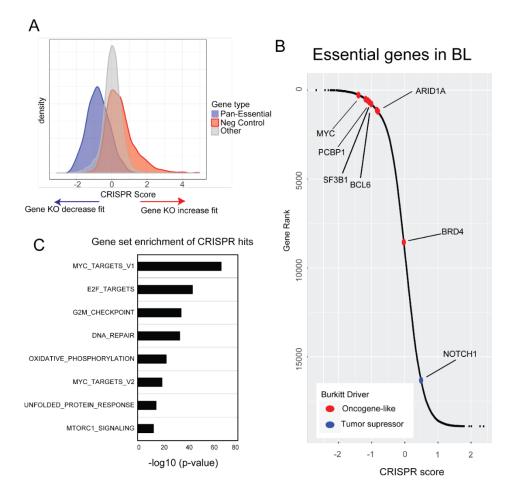
We have analyzed the somatic variants identified in the 101 Burkitt lymphoma samples to infer mutational signatures⁵ and to highlight processes that lead to tumorigenesis. We initially inferred somatic signatures in 6 groups (endemic, sporadic and HIV with their EBV status) and observed that sporadic and HIV cases shared the same signature profiles, and thus combined them to increase statistical power. We reanalyzed mutation signatures from the 4 groups (Endemic_EBV+, Endemic_EBV-, Sporadic/HIV_EBV+, Sporadic/HIV_EBV-) and identified 3 signatures which explained >99% of the variance (**Figure S3A, B**). These 3 inferred signatures (S1, S2 and S3) were correlated to the COSMIC database of known signatures⁵, and are associated with distinct mechanisms. S1 is associated with transcriptional strand bias for C>A mutations, S2 is associated with dysregulation of AID activity, and S3 is associated with transcriptional strand bias for C>T mutations.



CRISPR screen analysis

We performed an unbiased CRISPR screen targeting 19,050 genes to identify essential genes in three BL cell lines (BJAB, BL41, Jijoye). Gene knockout effects were consistent with biological expectation and results from previous CRISPR screens^{6,7}. As shown in **Figure S4A**, sgRNAs targeting genes that had been previously demonstrated to be essential across multiple human cell types (shown in blue) resulted in significantly decreased cell fitness relative to randomly chosen sgRNAs (shown in gray). By contrast, non-targeting control sgRNAs (shown in red) showed a significant increase in cell fitness relative to randomly chosen sgRNAs.

We identified 889 essential genes whose silencing resulted in significantly decreased proliferation in the BL cell lines (**Figure S4B**). Driver genes are highlighted in the plot. We then performed a gene set enrichment analysis⁸ on these 889 essential genes using Msigdb Hallmarks gene sets and identified *MYC*, E2F targets, cell cycle and DNA repair as the top results (**Figure S4C**).



Supplementary Figure S4: Essential genes identified using CRISPR screens in BL.

(A) Histogram of CRISPR scores shows that panessential genes have lower scores compared to negative controls. (B) Waterfall plot showing genes ranked by CRISPR score. Essential genes which are also BL drivers are highlighted. (C) Gene set enrichment performed on CRISPR hits using Msigdb Hallmarks gene sets are shown as a barplot.

Confirmatory data of ID3 and TCF4 CRISPR engineered deletions

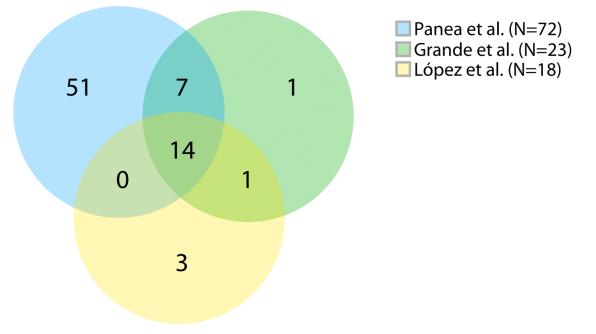
We used CRISPR methods to introduce deletion events in *ID3* and *TCF4* in order to disrupt function. We successfully engineered 3 cell lines to have large deletions (ranging from 11 to 548 base pairs) in *ID3* (**Figure S5A**). Similarly, we engineered 2 cell lines to have large deletions (ranging from 217 to 261 base pairs) in *TCF4* (**Figure S5B**). Western blot analysis confirms loss of protein in *ID3* CRISPR engineered cells (**Figure S5C**).

WT ID3 CCCGCCTCTCCCCGGTATCAGCGCTTCCTCATTCTTTGAATCCGCGGCTCCGCGGTCTTCGGCGTCAGACCAGCCGGAGGAAGCC Α Cellline1KDCCCGCCTCTCCCC GGTATCAGCGCTTCCTCATTCTTTGAATC Cellline2KDC0 ellline3KD TGCAATTTAAG CCCCAGCATGAAGGCGCTGAGCCCGGTGCGCGGCTGCTACGAGGCGGTGTGCTGCCTGTCGGAACGCAGTCTGGCCATCGCCCGGGG GGCCCGGCAGCTGAGGAGCCGCTGAGCTTGCTGGACGACATGAACCACTGCTACTCCCGCCTGCGGGAACTGGTACCCGGAGTCCCGAGAGGCACTC AGCTTAGCCAGGTGGAAATCCTACAGCGCGTCATCGACTACATTCTCGACCTGCAGGTAGTCCTGGCCGAGCCCAGCCCCTGGACCCCCTGATGG CCACCTTCCCATCCAGGTAAGCCTCGAAGTCGGGGACAGGGCTGAACACCCAGGCAAGGATGCTGCGGGGACCCTCGGAGCTCCCGATTGCCTCGCG GGACAGGGCTGAACACCCAGGCAAGGATGCTGCGGGA WT TCF4 CACAAGCTCCTCACGAGCTCTGCAAGGAGGCTGGCCTGCACTGACCTCGGACTTGCTGCTCCAGACTGAGGATGACGGCCACCGC В CellLine1KDCA ellLine2KD TGGTGGAGGATCAGGAGCTTGGTCTGGGGGCTTGTCACTCTTGAGGTGGAGCTGCACCATGCGGCCGAGCTCTTTGAAAGCCTCGTTGATGTCACGGA CCGCAGACGCTCTCGGGCATTGTTGGCCATCCTCCGCTCCTCTCACGCTCTGCCTCTGGTGTCAGGTCCTCATCGTCATTATTGCTGTGG GACAAAAAGGGATGCAACATTTTCTAATGGTGTGGGGAAAAAGAAGGTGTCTACATTACTTTGTTTTCTTCCAGAGTTTTCAGGGAACTTTTCCATCT GGGCCTACATTACTTIGTTTCTTCCAGAGTTTTCAGGGAACTTTTCCATC GGGGGCCTACATTACTTIGTTTTCTTCCAGAGTTTTCAGGGAACTTTTCCATC AGGGATGCAACATTTTCTAATGGTGTGG

Supplementary Figure S5: Confirmation of CRISPR engineered deletions in ID3 and TCF4 in cell lines. Alignment of wild type and CRISPR engineered knock out in (A) *ID3* and (B) *TCF4.*

Comparison of driver genes in Burkitt lymphoma whole genome studies

We compared our driver genes list with recent whole genome studies^{9,10} and we found an overlap of 21 out of the 23 significant genes from *Grande et al.* and 14 out of 18 significant genes from *López et al.* Our study did not identify as driver genes 2 genes (*PCBP1, P2RY8*) from *Grande* et al and 4 genes (*PCBP1, E2F2, ADNP, HNRNDP*) from *López et al*, while we identified an additional set of 51 mutated driver genes, including *MYC, IGLL5* and *BACH2*. **Figure S6** shows the comparison as a Venn diagram.



Supplementary Figure S6: Driver gene comparison with previous studies. Venn diagram shows the overlap between the identified driver genes by the current article, *Grande et al.* and *López et al.*

Identification of 11q gains/losses in BL samples

We have identified one sporadic case to have 11q24.2-qter loss, but no copy number gains for 11q23.2-q23.3. Additionally, we have identified an HIV-positive case to have 11q23.2-q23.3 copy number gains, but no telomeric losses of 11q24.1-qter.

Mutational distributions for Frozen vs. FFPE samples

We have extensively compared the application of next generation sequencing in frozen and paraffin cases in our previous work with diffuse large B cell lymphoma¹. Here, we compared the number of driver variants in FFPE vs. Frozen tumors to evaluate potential biases introduced by sequencing FFPE cases. In all, we had 65 FFPE cases and 36 frozen cases. The mean number of somatic and driver events in both groups were highly similar (P>0.4, Wilcoxon rank sum test).

Supplemental Figures

Supplemental Figure S1: Validation of translocation t(8,7) – *MYC* and *ACTB* Supplemental Figure S2: Distribution of somatic variants in driver genes Supplemental Figure S3: Mutational signatures analysis Supplemental Figure S4: CRISPR screen analysis Supplemental Figure S5: Confirmation of ID3 and TCF4 CRISPR engineered BL cell lines Supplemental Figure S6: Driver gene comparison with previous studies

Supplemental Tables

Table S1: Sample annotations for the 101 Burkitts patients in our study. Mapping rate and PCR duplication rate are calculated after trimming and alignment.

Table S2: Filtered somatic variants for the 101 Burkitt lymphoma samples.

Table S3: Genomic clusters, of the 228,010 somatic variants, that contain at least 4 variants and 3 unique samples.

Table S4: Sanger validation for driver gene variants.

Table S5: Gene-level genetic alterations for the 101 samples.

 Table S6: Gene-level mutational associations.

Table S7: Differential gene expression associated with driver gene mutations.

Table S8: Genesets associated with driver gene mutations.

Table S9: Comparison of differential gene expression for Burkitts vs. DLBCL.

Table S10: Comparison of differential genesets for Burkitts vs. DLBCL.

Table S11: CRISPR score for each gene by cellline.

 Table S12: Oligonucleotides used in the study.

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