SUPPLEMENTAL METHODS

RNA extraction, RNA sequencing, and quantitative real-time PCR

Total RNA was extracted from FFPE samples using the AllPrep DNA/RNA FFPE kit (Qiagen) per the manufacturer's guidelines. One microgram of extracted RNA was allocated for library preparation following the dUTP strand-specific protocol, with ribosome RNA removed using the Ribo-Zero rRNA Removal Kit (Human) (Illumina, San Diego, USA). 50bp single-end reads were generated on an Illumina HiSeq 4000 platform at The University of Chicago Functional Genomics Facility. The quality of raw paired-end (PE) reads was assessed by FastQC $(v0.11.5)$ $(v0.11.5)$ $(v0.11.5)$.¹ Reads were aligned to human reference transcriptome (GRCh38) with Gencode gene annotation $(v28)^2$ using Kallisto $(v0.43.1)$.³ Transcript abundance was quantified at transcript level specifying strand-specific protocol by Kallisto and summarized into gene level by tximport $(v1.6.0)$.^{[4](https://paperpile.com/c/Gw3ryW/hMeQ)} Lowly expressed genes were defined as those with CPM (counts per million of mapped reads) \leq 2 in a sample and removed from further analysis. Genes with CPM $>$ 2 in at least 6 samples were kept for normalization by TMM (trimmed mean of M values) method, followed by log2-transformation. Differentially expressed genes (DEGs) between *PD-L1* altered and *PD-L1* not altered groups were identified using Linear Models for Microarray Data (limma) voom method with precision weights $(v3.34.5)$ $(v3.34.5)$ $(v3.34.5)$.⁵ Significant DEGs were defined as those that passed filters of FDR-adjusted $P < 0.05$, and fold change ≥ 1.5 or ≤ -1.5 .

GO (Gene Ontology)⁶ biological processes and KEGG pathways^{[7](https://paperpile.com/c/Gw3ryW/61wF)} significantly enriched within the DEGs were identified using enrichGO and enrichKEGG function from Bioconductor package clusterProfiler (v3.6.0),^{[8](https://paperpile.com/c/Gw3ryW/HZqE)} respectively. The prediction of upstream regulators in IPA was performed in accordance with previous studies.^{[9](https://paperpile.com/c/Gw3ryW/fJgA)} Gene set enrichment analysis (GSEA)¹⁰ was

performed using the javaGSEA desktop software to compare biologically relevant gene signatures in *PD-L1* gene-altered and not altered samples. Specifically, $log2$ transformed expression data was ranked according to the default Signal2Noise ranking metric, and GSEA was performed using datasets in the Hallmark,^{[11](https://paperpile.com/c/Gw3ryW/7eoi)} Biocarta, and C2 gene sets from the Molecular Signature Database (MSigDB) (v6.2).^{[10](https://paperpile.com/c/Gw3ryW/SAyP)} The statistical significance of the enrichment score was calculated by using default software settings, and permuting the phenotype labels 1000 times.^{10,12}

Five hundred nanograms of extracted mRNA was also used to synthesize cDNA (Applied Biosystems high capacity cDNA reverse transcription kit) for quantitative real-time PCR of *PD-L1* transcripts. Primer pairs were generated across joining exons to avoid amplification of contaminating genomic DNA. Relative expression of *PD-L1* was assessed and normalized against a housekeeping gene (β*-actin*) using the Viia7 Applied Biosystem qPCR system.

DNA extraction and whole exome sequencing

DNA was isolated from FFPE samples using the AllPrep DNA/RNA FFPE kit (Qiagen) per the manufacturer's guidelines. Corresponding germline DNA was obtained from peripheral blood mononuclear cells using the DNeasy Blood and Tissue kit (Qiagen). Whole exomes and untranslated regions (UTR) were captured using the Agilent SureSelect Human All Exon V6 plus UTR kit (Agilent Technologies, Santa Clara, USA). 101bp PE reads were generated on an Illumina HiSeq 2500 instrument at Theragen Etex Bio Institute (Seoul, South Korea). Raw sequencing data were analyzed by an in-house pipeline constructed for WES analyses of paired or unpaired cancer genomes. The quality of raw reads was assessed by FastQC $(v0.11.5)$ $(v0.11.5)$ $(v0.11.5)$,¹ and preprocessed to trim adaptors and low-quality bases using Trimmomatic $(v0.36)^{13}$ and merge 3' overlapping mates using FLASH $(v1.2.11)$.¹⁴ Reads were aligned to the decoy version of human reference genome (GRCh38.d1.vd1) using BWA-MEM $(v0.7.17)^{15}$ with soft-clipping option activated by default. Read duplicates were marked using Sambamba $(v0.6.7)$, ¹⁶ and alignments of mapping quality <30 were removed. Read alignment was further refined for insertions/deletions (indels) realignment and base quality score recalibration (BQSR) using GATK4 (v4.0.4.0).^{17,18} Putative somatic mutations were identified using the GATK4-MuTect2^{[19](https://paperpile.com/c/Gw3ryW/DKw6)} following GATK's best practice protocol.¹⁸ For the 19 tumors with matched normal tissues, variants were called using paired tumor-normal mode. For the 2 tumors without matched normal tissue available, we first generated a Panel of Normal (PON) using the normal samples of the other 19 tumors as recommended by GATK protocols, and then called somatic variants with this PON variant file as the control. The raw variant calls were post-processed by multiple filtering steps implemented in GATK4, followed by stringent downstream custom filters. The resulting high-quality variants were further filtered to remove potential germline variants identified as those at allele frequency $(AF) \ge 0.0001$ in gnomMAD database (Genome Aggregation Database). 20

Variants that passed all filters were carried on for annotation using ANNOVAR (April 2018 release).^{[21](https://paperpile.com/c/Gw3ryW/8Twq)} Somatic mutation burden was calculated by the total number of somatic mutations that were predicted to cause a protein sequence change, including non-synonymous, stopgain, and stoploss SNVs (single-nucleotide variants), frameshift and non-frameshift indels, and variants that modify splicing sites. Putative neoantigens derived from protein-changing somatic mutations in each lymphoma specimen were predicted using netMHCpan $(v4.0)$,²² and filtered by gene expression from RNAseq data. Patients' MHC class I haplotypes were predicted from WES of germline DNA using Optitype $(v1.3.1)$.^{[23](https://paperpile.com/c/Gw3ryW/s3p1)} 9-mer mutant peptides were predicted using a sliding window approach centered at the mutated site of the protein sequence, and those

with a predicted binding affinity to HLA-A molecule ≤ 500 nM were selected as putative neoantigens.

External validation dataset

Preprocessed log2 ratios of hybridization probe intensities from Affymetrix SNP 6.0 $arays, ²⁴$ non-silent somatic mutations from whole exome sequencing in mutation annotation format (MAF) ,²⁵ gene expression FPKM (Fragments Per Kilobase of transcript per Million mapped reads)²⁶ values from RNAseq, and clinical data were downloaded for patients with DLBCL in a previously published study²⁷ as an external validation cohort from the National Cancer Institute's Genomic Data Commons data portal.^{[28](https://paperpile.com/c/Gw3ryW/nqsa)} A total of 476 cases were included in the analysis.

Identification of *PD-L1* **amplified cases in external dataset**

The $log2$ ratios of hybridization probe intensities in the 476 DLBCL cases^{[27](https://paperpile.com/c/Gw3ryW/bBZF)} were segmented using a circular binary segmentation (CBS) algorithm in DNAcopy $(v1.56.0)^{29}$ Discrete chromosomal regions with significant copy number variations (amplifications or deletions) were identified at a 99% confidence level in each sample using the Genomic Identification of Significant Targets in Cancer algorithm (GISTIC) $(v2.0)$.³⁰ Patients with a GISTIC score of 2 at the *PD-L1* locus, corresponding to a log2 copy ratio \geq 0.9 above baseline were classified as "amplified" (*n* = 21, 4.5%). Patients with a GISTIC score of 1 at the *PD-L1* locus, corresponding to a log2 copy ratio ≥ 0.1 above the baseline, were classified as "copy gain" $(n = 46, 9.6\%)$. Those with a GISTIC score of 0 or lower, corresponding to a log2 copy ratio < 0.1 above baseline, were classified as "non-amplified" ($n = 409, 85.9\%$). The amplified group (referred to hereafter as "*PD-L1* amplified") and non-amplified group were included in further analyses.

Clinical characterization and survival analysis

Clinical characteristics were extracted for the 476 DLBCL cases from Supplementary Data Appendix 2 of the published study,²⁷ matched to *PD-L1* amplification group assignments, and compared between *PD-L1* amplified and non-amplified cases by Fisher's exact test or Student's *t*-test $(R \text{ v3.5.1})$.^{[31](https://paperpile.com/c/Gw3ryW/bfF2)} Differences in the probability of overall survival (OS) and progression-free survival (PFS) between *PD-L1* amplified and non-amplified cases was tested by log-rank test using the R package survival $(v2.43)$.³² One and two year OS and PFS landmark analyses were performed using the R package landest $(v1.0)$.³³

Somatic mutation analysis

A total of 48745 non-silent somatic mutations identified in the 476 DLBCL cases were re-annotated using Oncotator $(v1.9)$.³⁴ 24980 driver mutations that occurred at a significantly higher rate than expected background mutational rates (defined as q-score < 0.1) were identified using MutSig2CV $(v3.11).^{35}$ $(v3.11).^{35}$ $(v3.11).^{35}$ The frequency of driver mutations in each sample was compared between *PD-L1* amplified and non-amplified cases by Fisher's exact test (R v3.5.1). Benjamini and Hochberg (BH) FDR method was used for multiple testing correction of P -values.^{36,37} Total tumor mutational burden (TMB) was assessed by the total number of non-silent protein-coding somatic mutations and compared between *PD-L1* amplified and non-amplified cases by nonparametric Wilcoxon rank-sum test (R v3.5.1).

RNAseq gene expression analysis

Preprocessed normalized and log2-transformed FPKM values derived from RNA sequencing experiments for the 476 DLBCL cases^{[27](https://paperpile.com/c/Gw3ryW/bBZF)} were used for the identification of differentially expressed genes (DEGs) and pathways between *PD-L1* amplified and nonamplified cases. Raw RNAseq FastQ files were not yet released at the time of this study. Out of 25066 genes total, 17981 genes with log2-FPKM > 5 in at least 10 samples were kept for further analysis. Significant DEGs were identified using limma $(v3.38.3)$,³⁸ filtered by FDR-corrected *P* \leq 0.05, and expression fold change \geq 1.5 or \leq -1.5. Gene ontology (GO)⁶ terms and Kyoto Encyclopedia of Genes and Genomes $(KEGG)^7$ pathways significantly enriched in genes of interest were identified using clusterProfiler $(v3.10.1)^8$ at FDR-corrected $P < 0.20$. Using the significant DEGs as downstream target molecules in Ingenuity Pathway Analysis (IPA, © Qiagen, accessed Feb 6, 2019) causal network analysis, 9 the upstream regulators were identified in accordance with previous studies.^{6,7,9} Gene set enrichment analysis (GSEA) was performed using the javaGSEA desktop software to compare biologically relevant gene signatures between *PD-L1* amplified and non-amplified cases. In brief, log2-transformed gene expression data were ranked higher to lower according to the default Signal2Noise ranking metric, and GSEA was performed using Hallmark, Biocarta, and C2 curated gene sets from the Molecular Signatures Database (MSigDB v6.2).^{[10,11](https://paperpile.com/c/Gw3ryW/SAyP+7eoi)} The statistical significance of the enrichment score was accessed using default software settings with 1000 permutations.^{10,12}

RESULTS: ANALYSIS OF EXTERNAL DATASET

Identification and characterization of *PD-L1* **amplified cases**

Using the gene-centric and broad peak results from GISTIC analysis, 21 samples (4.5%) were identified as *PD-L1* amplified (see Supplemental Methods). *JAK2*, which also resides on the 9p24.1 cytoband, was co-amplified in 19 (90.4%) of 21 amplified samples. *PD-L1* amplified cases were associated with significantly increased *PD-L1* expression ($P = 2.3e-21$, limma DEG analysis) (supplemental Figure 8), consistent with prior reports $39,40$. For the current analysis, we focused exclusively on the extreme phenotypes (21 *PD-L1* amplified cases *versus* 409 *PD-L1* non-amplified cases). *PD-L1* amplified cases were significantly associated with the activated Bcell (ABC) gene expression subtype, higher international prognostic index score, and higher LDH levels (supplemental Table 3). No strong association with *PD-L1* amplification was detected for age, sex, or genetic subgroup (as defined in Schmitz et al^{27}). Overall survival (OS) was significantly inferior at one year in the *PD-L1* amplified group compared to the *PD-L1* nonamplified group $(55.7\%$ vs 83.7% , $P = 0.04$, log-rank test). No significant differences were detected in one-year progression-free survival (PFS) or two-year OS and PFS between the two groups.

PD-L1 **amplifications and somatic mutations**

No significant differences were detected in driver mutation frequency between *PD-L1* amplified and non-amplified cases after correction for multiple testing. No significant differences were detected in total tumor mutational burden (TMB) between the *PD-L1* amplified and nonamplified groups (supplemental Figure 10, $P = 0.34$, Wilcoxon rank-sum test).

PD-L1 **amplifications and gene expression patterns**

The *PD-L1* amplified group demonstrated significantly higher gene expression of *PD-L1, CD8A,* and *CD4* relative to the non-amplified group (supplemental Figure 8). 488 significantly differentially expressed genes (DEGs) were identified comparing the two groups at FDRcorrected p-value ≤ 0.05 , and fold change ≥ 1.5 or ≤ -1.5 (supplemental Figure 9A). Gene ontology analysis of the *PD-L1* amplified group's differentially expressed genes found the highest overlap in neutrophil-related pathways, followed by phagocytosis and T-cell activation (supplemental Figure 9B). IPA upstream regulator causal network analysis identified significant activation in the transcriptional programs of NF- κ B (Z-score 2.93, *P* = 6.37e-6), TNF (Z-score 4.16, $P = 3.06e-13$) and IFNG (Z-score = 5.42, $P = 4.35e-30$) in the *PD-L1* amplified group (supplemental Figure 9C). GSEA found significant activation in the Hallmark TNF signaling via NF- κ B pathway, as was seen in our primary tumor analysis (Figure 3E; supplemental Figure 9D).

To investigate the influence of activated B-cell (ABC) enrichment in the *PD-L1* amplified subgroup, we repeated the same analysis comparing *PD-L1* amplified (*n* = 21) to ABC-only non-amplified cases $(n = 219)$. 1705 significant DEGs were identified using the same thresholds described above. IPA upstream regulator causal network analysis identified similar results as that of all non-amplified samples. For example, activation in $NF-\kappa B$ complex (Z-score $= 5.267$, $P = 3.2e-10$), TNF (Z-score = 6.325, $P = 5.15e-32$) and IFNG (Z-score = 6.752, $P =$ 2.54e-41) pathways was observed within the *PD-L1* amplified group relative to ABC-only nonamplified cases. GSEA analysis also found significant activation in the Hallmark TNF signaling via NF- κ B pathway within *PD-L1* amplified samples $(P = 0.019)$. Collectively these results suggest that the differential gene expression seen between *PD-L1* amplified and non-amplified cases are independent of gene expression subgroup enrichment.

SUPPLEMENTAL TABLES

Supplemental Table 1. Treatment status of samples used for study experiments.

Supplemental Table 2. Differentially expressed genes between *PD-L1* **altered and** *PD-L1* **not altered DLBCLs.**

Supplemental Table 3. Baseline characteristics of *PD-L1* **amplified DLBCLs in an external dataset.**

SUPPLEMENTAL FIGURES

Supplemental Figure 1. Residual *PD-L1* **disomic lymphoma cells in DLBCL specimens according to** *PD-L1* **locus status.** Percentage of residual *PD-L1* disomic lymphoma cells in DLBCLs with the indicated mechanism of *PD-L1* gene alteration as assessed by FISH is shown (****P* < 0.001, Mann-Whitney *U* test).

Supplemental Figure 2. Representative IHC images for PD-L1, CD8, and HLA class I and II in *PD-L1* **gene-altered and** *PD-L1* **not altered cases.** IHC images depicting CD8⁺ T cell infiltration and expression of HLA I/II and PD-L1 in representative DLBCLs with *PD-L1* disomy, copy gain or amplification. The *PD-L1* disomic DLBCL specimen (top row) was largely devoid of CD8+ T cells, exhibited normal HLA class I and II staining, and was PD-L1 negative. The DLBCL case harboring a relative *PD-L1* copy gain (middle row) contained numerous CD8⁺ T cells, was negative for class I and II HLA staining (note positive HLA class I staining of infiltrating non-malignant immune cells), and displayed moderately-intense PD-L1 expression. Finally, the *PD-L1* gene-amplified DLBCL specimen (bottom row) was robustly infiltrated by CD8+ T cells, had reduced HLA class I expression compared to surrounding non-malignant cells, was negative for HLA class II, and exhibited very intense and diffuse PD-L1 expression.

Supplemental Figure 3. CD4+ T cell infiltration in *PD-L1* **altered versus not altered DLBCLs.** Numbers of CD4⁺ T cells/hpf in *PD-L1* altered and *PD-L1* not altered DLBCLs as assessed by IHC ($P = 0.30$, Mann-Whitney *U* test).

Supplemental Figure 4. Combined HLA class I and II cell surface expression according to

PD-L1 **locus status.** Percentage of DLBCLs with normal, reduced, or absent HLA class I and/or II expression as assessed by IHC according to *PD-L1* locus status ($P = 0.028$, Fisher's exact test).

Supplemental Figure 5. *PD-L1* **mRNA expression according to** *PD-L1* **locus status.** Relative *PD-L1* mRNA expression compared to a housekeeping gene (*ACTB)* was assessed by quantitative PCR in *PD-L1* gene-altered and not altered DLBCLs (n=47). Experiments were performed in triplicate with the average being depicted (****P* = 0.004, Mann-Whitney *U* test).

Supplemental Figure 6. Predicted HLA-A neo-antigen burden in *PD-L1* **gene-altered versus not altered DLBCL** $(P = 0.853$, Mann-Whitney *U* test).

Supplemental Figure 7. One-year OS is significantly worse in the *PD-L1* **amplified group, with non-significant observed differences in PFS in a validation dataset.** Overall survival and progression free survival were not significantly different between the *PD-L1* amplified and nonamplified groups over the entire course of follow-up (OS $P = 0.2$, PFS, $P = 0.3$ with log-rank test). *P*-value from landmark survival analysis at one year using the Kaplan-Meier estimator is shown for OS $(P = 0.04$, log-rank test) and PFS $(P = 0.07$, log-rank test).

Supplemental Figure 8. *PD-L1* **gene amplifications are associated with increased expression of PD-L1, CD8A and CD4 in a validation dataset.** Gene expression of *PD-L1*, *CD8A*, and *CD4* was compared between *PD-L1* amplified ($n = 21$) and non-amplified groups ($n = 409$). Violin plots of (**A**) *PD-L1*, (**B**) *CD8A*, (**C**) *CD4* gene expression in *PD-L1* amplified versus nonamplified DLBCLs. The mean is marked with a horizontal bar, and width of the violin plot corresponds to the number of samples with that y-value. Significance testing was performed in the entire gene expression cohort with limma and Ebayes as described above, reported here for

the individual genes.

Supplemental Figure 9. RNA sequencing identifies differentially-expressed genes in *PD-L1* **amplified relative to** *PD-L1* **non-amplified DLBCLs in a validation dataset.** (**A**) Volcano plot summarizing 488 differentially expressed genes (DEG) in DLBCLs with vs without *PD-L1* gene amplifications (FDR-adjusted $P < 0.05$, fold change >1.5 or ≤ -1.5) in 430 previously-published RNAseq profiles. [27](https://paperpile.com/c/Gw3ryW/bBZF) (**B**) GO analysis performed on the 488 DEGs. GO terms significantly enriched in DLBCLs with *PD-L1* gene amplifications are denoted by red dots. (**C**) Ingenuity Pathway Analysis revealing predicted upstream regulators of gene expression activated (positive z-score) or inhibited (negative z-score) in DLBCLs with *PD-L1* amplifications relative to those without. Vertical line indicates the position of $P = 0.05$ on the x-axis. (**D**) GSEA demonstrating enrichment of NF-κB-regulated genes in *PD-L1* amplified compared to *PD-L1* non-amplified DLBCLs.

Supplemental Figure 10. Tumor mutational burden in *PD-L1* **gene-amplified and nonamplified DLBCLs in a validation dataset.** Total tumor mutational burden (TMB), defined as non-silent protein-changing somatic mutations per sample, was compared between *PD-L1* amplified ($n = 21$) and non-amplified samples ($n = 409$) ($P = 0.34$, Wilcoxon rank sum test). The mean is marked with a horizontal bar, and the width of the violin plot corresponds to the number of samples with a given y-value.

Pre-Pembrolizumab

9 Months Post-Pembrolizumab

Supplemental Figure 11. Coronal PET images before and after pembrolizumab therapy for patient

included in Figure 5C.

SUPPLEMENTAL REFERENCES

- 1. [Andrews S. FastQC: A quality control application for high throughput sequence data.](http://paperpile.com/b/Gw3ryW/xmj4) *[Babraham Institute Project page: http://www. bioinformatics. bbsrc. ac. uk/projects/fastqc](http://paperpile.com/b/Gw3ryW/xmj4)*[.](http://paperpile.com/b/Gw3ryW/xmj4) [2012;](http://paperpile.com/b/Gw3ryW/xmj4)
- 2. [Derrien T, Johnson R, Bussotti G, et al. The GENCODE v7 catalog of human long](http://paperpile.com/b/Gw3ryW/PFOp) [noncoding RNAs: analysis of their gene structure, evolution, and expression.](http://paperpile.com/b/Gw3ryW/PFOp) *[Genome Res.](http://paperpile.com/b/Gw3ryW/PFOp)* [2012;22\(9\):1775–1789.](http://paperpile.com/b/Gw3ryW/PFOp)
- 3. [Bray NL, Pimentel H, Melsted P, Pachter L. Erratum: Near-optimal probabilistic RNA-seq](http://paperpile.com/b/Gw3ryW/HHZ0) [quantification.](http://paperpile.com/b/Gw3ryW/HHZ0) *[Nat. Biotechnol.](http://paperpile.com/b/Gw3ryW/HHZ0)* [2016;34\(8\):888.](http://paperpile.com/b/Gw3ryW/HHZ0)
- 4. [Soneson C, Love MI, Robinson MD. Differential analyses for RNA-seq: transcript-level](http://paperpile.com/b/Gw3ryW/hMeQ) [estimates improve gene-level inferences.](http://paperpile.com/b/Gw3ryW/hMeQ) *[F1000Res.](http://paperpile.com/b/Gw3ryW/hMeQ)* [2015;4:1521.](http://paperpile.com/b/Gw3ryW/hMeQ)
- 5. [Law CW, Chen Y, Shi W, Smyth GK. voom: Precision weights unlock linear model analysis](http://paperpile.com/b/Gw3ryW/0Yf4) [tools for RNA-seq read counts.](http://paperpile.com/b/Gw3ryW/0Yf4) *[Genome Biol.](http://paperpile.com/b/Gw3ryW/0Yf4)* [2014;15\(2\):R29.](http://paperpile.com/b/Gw3ryW/0Yf4)
- 6. [Ashburner M, Ball CA, Blake JA, et al. Gene ontology: tool for the unification of biology.](http://paperpile.com/b/Gw3ryW/Hosp) [The Gene Ontology Consortium.](http://paperpile.com/b/Gw3ryW/Hosp) *[Nat. Genet.](http://paperpile.com/b/Gw3ryW/Hosp)* [2000;25\(1\):25–29.](http://paperpile.com/b/Gw3ryW/Hosp)
- 7. [Kanehisa M, Sato Y, Kawashima M, Furumichi M, Tanabe M. KEGG as a reference](http://paperpile.com/b/Gw3ryW/61wF)

[resource for gene and protein annotation.](http://paperpile.com/b/Gw3ryW/61wF) *[Nucleic Acids Res.](http://paperpile.com/b/Gw3ryW/61wF)* [2016;44\(D1\):D457–62.](http://paperpile.com/b/Gw3ryW/61wF)

- 8. [Yu G, Wang L-G, Han Y, He Q-Y. clusterProfiler: an R package for comparing biological](http://paperpile.com/b/Gw3ryW/HZqE) [themes among gene clusters.](http://paperpile.com/b/Gw3ryW/HZqE) *[OMICS: A Journal of Integrative Biology](http://paperpile.com/b/Gw3ryW/HZqE)*[. 2012;16\(5\):284–](http://paperpile.com/b/Gw3ryW/HZqE) [287.](http://paperpile.com/b/Gw3ryW/HZqE)
- 9. [Kramer A, Green J, Pollard J Jr, Tugendreich S. Causal analysis approaches in Ingenuity](http://paperpile.com/b/Gw3ryW/fJgA) [Pathway Analysis.](http://paperpile.com/b/Gw3ryW/fJgA) *[Bioinformatics](http://paperpile.com/b/Gw3ryW/fJgA)*[. 2014;30\(4\):523–530.](http://paperpile.com/b/Gw3ryW/fJgA)
- 10. [Subramanian A, Tamayo P, Mootha VK, et al. Gene set enrichment analysis: a knowledge](http://paperpile.com/b/Gw3ryW/SAyP)[based approach for interpreting genome-wide expression profiles.](http://paperpile.com/b/Gw3ryW/SAyP) *[Proc. Natl. Acad. Sci. U.](http://paperpile.com/b/Gw3ryW/SAyP) [S. A.](http://paperpile.com/b/Gw3ryW/SAyP)* [2005;102\(43\):15545–15550.](http://paperpile.com/b/Gw3ryW/SAyP)
- 11. [Liberzon A, Subramanian A, Pinchback R, et al. Molecular signatures database \(MSigDB\)](http://paperpile.com/b/Gw3ryW/7eoi) [3.0.](http://paperpile.com/b/Gw3ryW/7eoi) *[Bioinformatics](http://paperpile.com/b/Gw3ryW/7eoi)*[. 2011;27\(12\):1739–1740.](http://paperpile.com/b/Gw3ryW/7eoi)
- 12. [Mootha VK, Lindgren CM, Eriksson K-F, et al. PGC-](http://paperpile.com/b/Gw3ryW/POUM)1α-responsive genes involved in [oxidative phosphorylation are coordinately downregulated in human diabetes.](http://paperpile.com/b/Gw3ryW/POUM) *[Nat. Genet.](http://paperpile.com/b/Gw3ryW/POUM)* [2003;34:267.](http://paperpile.com/b/Gw3ryW/POUM)
- 13. [Bolger AM, Lohse M, Usadel B. Trimmomatic: a flexible trimmer for Illumina sequence](http://paperpile.com/b/Gw3ryW/Nqh6) [data.](http://paperpile.com/b/Gw3ryW/Nqh6) *[Bioinformatics](http://paperpile.com/b/Gw3ryW/Nqh6)*[. 2014;30\(15\):2114–2120.](http://paperpile.com/b/Gw3ryW/Nqh6)
- 14. [Magoč T, Salzberg SL. FLASH: fast length adjustment of short reads to improve genome](http://paperpile.com/b/Gw3ryW/orIU) [assemblies.](http://paperpile.com/b/Gw3ryW/orIU) *[Bioinformatics](http://paperpile.com/b/Gw3ryW/orIU)*[. 2011;27\(21\):2957–2963.](http://paperpile.com/b/Gw3ryW/orIU)
- 15. [Li H. Aligning sequence reads, clone sequences and assembly contigs with BWA-MEM.](http://paperpile.com/b/Gw3ryW/ZpPw) *[arXiv \[q-bio.GN\]](http://paperpile.com/b/Gw3ryW/ZpPw)*[. 2013;](http://paperpile.com/b/Gw3ryW/ZpPw)
- 16. [Tarasov A, Vilella AJ, Cuppen E, Nijman IJ, Prins P. Sambamba: fast processing of NGS](http://paperpile.com/b/Gw3ryW/J5fT) [alignment formats.](http://paperpile.com/b/Gw3ryW/J5fT) *[Bioinformatics](http://paperpile.com/b/Gw3ryW/J5fT)*[. 2015;31\(12\):2032–2034.](http://paperpile.com/b/Gw3ryW/J5fT)
- 17. [DePristo MA, Banks E, Poplin R, et al. A framework for variation discovery and genotyping](http://paperpile.com/b/Gw3ryW/I8ur) [using next-generation DNA sequencing data.](http://paperpile.com/b/Gw3ryW/I8ur) *[Nat. Genet.](http://paperpile.com/b/Gw3ryW/I8ur)* [2011;43\(5\):491–498.](http://paperpile.com/b/Gw3ryW/I8ur)
- 18. [Van der Auwera GA, Carneiro MO, Hartl C, et al. From FastQ data to high confidence](http://paperpile.com/b/Gw3ryW/1S5c) [variant calls: the Genome Analysis Toolkit best practices pipeline.](http://paperpile.com/b/Gw3ryW/1S5c) *[Curr. Protoc.](http://paperpile.com/b/Gw3ryW/1S5c) [Bioinformatics](http://paperpile.com/b/Gw3ryW/1S5c)*[. 2013;43:11.10.1–33.](http://paperpile.com/b/Gw3ryW/1S5c)
- 19. [Cibulskis K, Lawrence MS, Carter SL, et al. Sensitive detection of somatic point mutations](http://paperpile.com/b/Gw3ryW/DKw6) [in impure and heterogeneous cancer samples.](http://paperpile.com/b/Gw3ryW/DKw6) *[Nat. Biotechnol.](http://paperpile.com/b/Gw3ryW/DKw6)* [2013;31\(3\):213–219.](http://paperpile.com/b/Gw3ryW/DKw6)
- 20. [Lek M, Karczewski KJ, Minikel EV, et al. Analysis of protein-coding genetic variation in](http://paperpile.com/b/Gw3ryW/UkJg) [60,706 humans.](http://paperpile.com/b/Gw3ryW/UkJg) *[Nature](http://paperpile.com/b/Gw3ryW/UkJg)*[. 2016;536\(7616\):285–291.](http://paperpile.com/b/Gw3ryW/UkJg)
- 21. [Wang K, Li M, Hakonarson H. ANNOVAR: functional annotation of genetic variants from](http://paperpile.com/b/Gw3ryW/8Twq) [high-throughput sequencing data.](http://paperpile.com/b/Gw3ryW/8Twq) *[Nucleic Acids Res.](http://paperpile.com/b/Gw3ryW/8Twq)* [2010;38\(16\):e164–e164.](http://paperpile.com/b/Gw3ryW/8Twq)
- 22. Jurtz V, [Paul S, Andreatta M, et al. NetMHCpan-4.0: Improved Peptide–MHC Class I](http://paperpile.com/b/Gw3ryW/8ioO) [Interaction Predictions Integrating Eluted Ligand and Peptide Binding Affinity Data.](http://paperpile.com/b/Gw3ryW/8ioO) *[The](http://paperpile.com/b/Gw3ryW/8ioO) [Journal of Immunology](http://paperpile.com/b/Gw3ryW/8ioO)*[. 2017;ji1700893.](http://paperpile.com/b/Gw3ryW/8ioO)
- 23. Szolek A, Schubert B, Mohr C, et al. OptiType: precision HLA typing from next-generation [sequencing data.](http://paperpile.com/b/Gw3ryW/s3p1) *[Bioinformatics](http://paperpile.com/b/Gw3ryW/s3p1)*[. 2014;30\(23\):3310–3316.](http://paperpile.com/b/Gw3ryW/s3p1)
- 24. [Use of Affymetrix Mapping Arrays in the Diagnosis of Gene Copy Number Variation.](http://paperpile.com/b/Gw3ryW/suzW) *[Current Protocols in Human Genetics](http://paperpile.com/b/Gw3ryW/suzW)*[. 2001;79:500.](http://paperpile.com/b/Gw3ryW/suzW)
- 25. [GDC MAF Format v1.0.0.](http://paperpile.com/b/Gw3ryW/Tfqc) *[Genomic Data Commons Documentation](http://paperpile.com/b/Gw3ryW/Tfqc)*[. .](http://paperpile.com/b/Gw3ryW/Tfqc)
- 26. [Li B, Dewey CN. RSEM: accurate transcript quantification from](http://paperpile.com/b/Gw3ryW/0aST) RNA-Seq data with or [without a reference genome.](http://paperpile.com/b/Gw3ryW/0aST) *[BMC Bioinformatics](http://paperpile.com/b/Gw3ryW/0aST)*[. 2011;12:323.](http://paperpile.com/b/Gw3ryW/0aST)
- 27. Schmitz [R, Wright GW, Huang DW, et al. Genetics and Pathogenesis of Diffuse Large B-](http://paperpile.com/b/Gw3ryW/bBZF)[Cell Lymphoma.](http://paperpile.com/b/Gw3ryW/bBZF) *[N. Engl. J. Med.](http://paperpile.com/b/Gw3ryW/bBZF)* [2018;378\(15\):1396–1407.](http://paperpile.com/b/Gw3ryW/bBZF)
- 28. [Jensen MA, Ferretti V, Grossman RL, Staudt LM. The NCI Genomic Data Commons as an](http://paperpile.com/b/Gw3ryW/nqsa)

[engine for precision medicine.](http://paperpile.com/b/Gw3ryW/nqsa) *[Blood](http://paperpile.com/b/Gw3ryW/nqsa)*[. 2017;130\(4\):453.](http://paperpile.com/b/Gw3ryW/nqsa)

- 29. [Seshan VE, Olshen A. DNAcopy: DNA copy number data analysis. R package version](http://paperpile.com/b/Gw3ryW/OGe9) [1.56.0. 2018.](http://paperpile.com/b/Gw3ryW/OGe9)
- 30. [Mermel CH, Schumacher SE, Hill B, et al. GISTIC2.0 facilitates sensitive and confident](http://paperpile.com/b/Gw3ryW/6p8U) [localization of the targets of focal somatic copy-number alteration in human cancers.](http://paperpile.com/b/Gw3ryW/6p8U) *[Genome Biol.](http://paperpile.com/b/Gw3ryW/6p8U)* [2011;12\(4\):R41.](http://paperpile.com/b/Gw3ryW/6p8U)
- 31. [Team RC, Others. R: A language and environment for statistical computing. 2018;](http://paperpile.com/b/Gw3ryW/bfF2)
- 32. [Therneau TM, Lumley T. Package "survival."](http://paperpile.com/b/Gw3ryW/tVSi) *[R Top Doc](http://paperpile.com/b/Gw3ryW/tVSi)*[. 2015;128.:](http://paperpile.com/b/Gw3ryW/tVSi)
- 33. Xie J, [Liu C. Adjusted Kaplan-Meier estimator and log-rank test with inverse probability of](http://paperpile.com/b/Gw3ryW/Vve6) [treatment weighting for survival data.](http://paperpile.com/b/Gw3ryW/Vve6) *[Stat. Med.](http://paperpile.com/b/Gw3ryW/Vve6)* [2005;24\(20\):3089–3110.](http://paperpile.com/b/Gw3ryW/Vve6)
- 34. [Ramos AH, Lichtenstein L, Gupta M, et al. Oncotator: cancer variant annotation tool.](http://paperpile.com/b/Gw3ryW/IpHq) *[Hum.](http://paperpile.com/b/Gw3ryW/IpHq) [Mutat.](http://paperpile.com/b/Gw3ryW/IpHq)* [2015;36\(4\):E2423–9.](http://paperpile.com/b/Gw3ryW/IpHq)
- 35. [Lawrence MS, Stojanov P, Polak P, et al. Mutational heterogeneity in cancer and the search](http://paperpile.com/b/Gw3ryW/dL9I) [for new cancer-associated genes.](http://paperpile.com/b/Gw3ryW/dL9I) *[Nature](http://paperpile.com/b/Gw3ryW/dL9I)*[. 2013;499\(7457\):214–218.](http://paperpile.com/b/Gw3ryW/dL9I)
- 36. [Glickman ME, Rao SR, Schultz MR. False discovery rate control is a recommended](http://paperpile.com/b/Gw3ryW/3vHA) [alternative to Bonferroni-type adjustments in health studies.](http://paperpile.com/b/Gw3ryW/3vHA) *[J. Clin. Epidemiol.](http://paperpile.com/b/Gw3ryW/3vHA)* [2014;67\(8\):850–857.](http://paperpile.com/b/Gw3ryW/3vHA)
- 37. [Benjamini Y, Hochberg Y. Controlling the False Discovery Rate: A Practical and Powerful](http://paperpile.com/b/Gw3ryW/udBb) [Approach to Multiple Testing.](http://paperpile.com/b/Gw3ryW/udBb) *[J. R. Stat. Soc. Series B Stat. Methodol.](http://paperpile.com/b/Gw3ryW/udBb)* [1995;57\(1\):289–300.](http://paperpile.com/b/Gw3ryW/udBb)
- 38. [Ritchie ME, Phipson B, Wu D, et al. limma powers differential expression analyses for](http://paperpile.com/b/Gw3ryW/rJwA) [RNA-sequencing and microarray studies.](http://paperpile.com/b/Gw3ryW/rJwA) *[Nucleic Acids Res.](http://paperpile.com/b/Gw3ryW/rJwA)* [2015;43\(7\):e47.](http://paperpile.com/b/Gw3ryW/rJwA)
- 39. [Georgiou K, Chen L, Berglund M, et al. Genetic basis of PD-L1 overexpression in diffuse](http://paperpile.com/b/Gw3ryW/DM2L) [large B-cell lymphomas.](http://paperpile.com/b/Gw3ryW/DM2L) *[Blood](http://paperpile.com/b/Gw3ryW/DM2L)*[. 2016;127\(24\):3026–3034.](http://paperpile.com/b/Gw3ryW/DM2L)
- 40. [Roemer MG, Advani RH, Ligon AH, et al. PD-L1 and PD-L2 Genetic Alterations Define](http://paperpile.com/b/Gw3ryW/bEsZ) [Classical Hodgkin Lymphoma and Predict Outcome.](http://paperpile.com/b/Gw3ryW/bEsZ) *[J. Clin. Oncol.](http://paperpile.com/b/Gw3ryW/bEsZ)* [2016;34\(23\):2690–](http://paperpile.com/b/Gw3ryW/bEsZ) [2697.](http://paperpile.com/b/Gw3ryW/bEsZ)