Supplementary Information

Pediatric Pan-CNS Tumor Analysis of Immune-cell Infiltration Identifies Correlates of Antitumor Immunity

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Supplementary Figure 1. Comparison of performance metrics for signature matrices. Performance metrics for methylCIBERSORT signature matrices given for a range of DMP (differentially methylated probes) and DB (delta beta) thresholds calculated using known flow-validated proportions in six control PBMC cell mixtures. Root mean square error (RMSE) and correlation are calculated as per Newman *et al*¹. Remainder is defined as the total proportion of the methylCIBERSORT estimation result being assigned to populations of the signature matrix not found in the PBMC input mixtures. Processing time not shown, but higher DMP and DB parameters significantly increase signature matrix size and required computation time. Overall it should be noted that any changes in performance were relatively trivial.

Supplementary Figure 2: Comparison of the signature matrix ability to differentiate between cell types. A. Heatmap showing mean beta values for CpGs (rows) used in the signature matrix by CNS tumor cell type/category for 3,763 CNS tumors and controls taken from Capper *et al* ² demonstrating broad consistency of methylation across all CNS tumor types and independence of the signature from confounding tumor-type related effects. Left-hand side columns represent mean beta values for each reference cell type. CNS tumor types/subtype/category colors and abbreviations are as per Capper *et al*² full key is given in Supplementary Table 4. **B.** Principle Components Analysis showing the lymphocyte profiles used to create the signature matrix and **C.** the eosinophil, monocyte and neutrophil profiles.

Supplementary Figure 3. Comparisons of estimated monocytes, macrophages and microglia infiltration. Scatterplot and significant correlation (each p<0.001) in 36 pHGG patients between estimated proportion of monocytes by methylCIBERSORT and expression signature scores defining all monocytes (top left), peripheral monocytes (top right) and microglia (bottom left). Heatmap scale shows the estimated proportion of the total monocyte expression signature attributable to microglia. Bottom right shows a boxplot of the estimated percentage of expression signature attributable to microglia in 36 pHGG patients.

Supplementary Figure 4: Immune clustering of pan-CNS tumors and controls shows 3 distinct clusters. A. Scatterplot showing the estimated methylCIBERSORT cancer fraction correlates significantly with Capper *et al's²* published estimates of tumor purity; Pearson's, Rho=0.7, p<0.001. **B.** Scatterplot showing the estimated methylCIBERSORT estimate of total T-lymphocyte infiltration correlates significantly with an independent meTIL score (as per Jeshcke *et al*³); Pearson's, Rho=0.29, p<0.0001. **C.** Boxplot showing methylCIBERSORT estimates of monocyte and neutrophil infiltration in control samples included within the Capper *et al* ² cohort; n=119 biologically independent samples. Box represents interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers. As expected significantly greater proportions of monocytes and neutrophils were observed in reactive and inflammatory tissues respectively **D.** Dotplots of the estimated median infiltration of specific cell types as a proportion of all non-cancer cell types by tumor type/subtype highlighting the range and variation of immune cell infiltration in different CNS tumor types. Dotted black lines represent the median for histological categories for a given cell type and dotted red lines mark a variance threshold of 1.96 standard deviations. Selected tumor types which exceed these variance thresholds are marked with text. **E.** t-SNE plot showing clustering of the panCNS cohort by immune cell estimates. Large panel shows three immune clusters (IC1-3), smaller panels show the location and distribution of tumors of particular subgroup, grade, stage and age, immune cell estimates are represented as a red-white color scale. P-values represent statistical test for non-random association of a given characteristic with immune-cluster.

Supplementary Figure 5: Associations between immune cell infiltration clustering and molecular subgrouping. A. Sankey plot showing proportions shared between panCNS immune clusters and tumor subgroup. Colors and text label marking tumor type/subtype are as per Capper *et al*² (for full key see Supplementary Table 4). **B.** Sankey plot showing proportions shared between panCNS immune clusters, MB immune clusters and MB subgroup. **C.** Sankey plot showing proportions shared between panCNS immune clusters, MRT immune clusters and MRT subgroup. **D.** Sankey plot showing proportions shared between panCNS immune clusters, pHGG immune clusters and pHGG subgroup.

Supplementary Figure 6: Clustering of estimated immune cell infiltration in MB shows four clusters. A. t-SNE plot showing clustering of the MB cohort by immune cell estimates. Large panel shows four immune clusters $(MB_{IC1}$ 4), smaller panels show the location and distribution of tumor of particular subgroup, immune cell estimates are represented as a red-white color scale. P-values represent statistical test for non-random association of a given

characteristic with immune-cluster. **B.** Boxplot showing proportion of non-cancer cells by presence of MYC amplification in MB_{Grp3}; n=408 biologically independent samples. Box represents interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers. **C.** Kaplan-Meier plot showing significantly different progression free survival (PFS) in MBGrp4 by low (< median) or high (> median) levels of monocyte infiltration; Log-Rank, p=0.0015, n=133. **D.** Kaplan-Meier plot showing significantly different progression free survival (PFS) in infant MB_{SHH} by low (< median) or high (> median) levels of Treg infiltration; Log-Rank, p=0.023, n=59. **E.** Boxplot showing expression of *PDL1* (F=4.0, p=0.009), *PD1* (F=1.9, p=0.123), *CD276* (F=6.251, p=0.000457) and CYT score (Cyt.score F=4.1, p=0.008), by MB immune cluster; n=185 biologically independent samples. Box represents interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers.

Supplementary Figure 7: Comparisons of methylation estimates of immune infiltration with parallel RNA-seq. A. Boxplot showing methylCIBERSORT estimates of CD8T infiltration and ssGSEA estimates of CD8T expression signature and **B**. B-cell expression signature in $n=185$ biologically independent parallel RNA-seq and $n=763$ biologically independent Affymetrix expression array data by Medulloblastoma subtype. **C.** Boxplot showing ssGSEA estimates of CD8T expression signature and **D**. B-cell expression signature in n=185 biologically independent parallel RNA-seq and n=763 biologically independent Affymetrix expression array profiles by immune cluster.All boxes represent interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers.

Supplementary Figure 8: Clustering of estimated immune cell infiltration of MRT and associated subgroup. A. Heatmap showing row-scaled relative levels of immune cell infiltration in 229 Malignant Rhabdoid Tumors (MRT) ordered by immune cluster MRTIC1-4. **B**. Boxplot showing estimated proportion of cell infiltration by molecular subgroup; n=229 biologically independent samples. **C.** Boxplot showing estimated monocyte infiltration $W = 1469.5$, p-value = 0.001 n=132 and **D.** NK infiltration in ATRT by CNS location (infratentorial/supratentorial) ; W = 2726.5, pvalue = 0.009, n=132 biologically independent samples. All boxes represent interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers.

Supplementary Figure 9: Comparisons of methylation and expression estimates of immune infiltration in MRT. A. Scatterplot showing CYT score correlation in Malignant Rhabdoid Tumors (MRT) with proportion of TILs as

estimated by methylCIBERSORT (Pearson, Rho = 0.64, p =0.001). **B.** scatterplot showing correlation of normalized CDR3 TCR reads with proportion of T-lymphocytes estimated by methylCIBERSORT (Pearson, Rho = 0.43 , p= 0.049) and **C.** BCR reads with proportion of B cells estimated by methylCIBERSORT (Pearson, Rho = 0.51, p=0.007). **D.** Boxplot showing CYT score and PDL1 expression by MRT immune cluster; n=28 biologically independent samples. **E.** Boxplot showing methylCIBERSORT estimates of CD8T infiltration and ssGSEA estimates of CD8T expression signature and **F.** B-cell expression signature in n=28 parallel RNA-seq profiles by MRT subtype. All boxes represent interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers.

Supplementary Figure 10: Clusters of immune cell infiltration estimatesin pHGG and associated characteristics. A. t-SNE plot showing clustering of the pHGG cohort by immune cell estimate large panel shows four immune clusters $(pHGG_{IC1-3})$, smaller panels show the location and distribution of tumors of particular subgroup, immune cell estimates

are represented as a red-white color scale. P-values represent statistical test for non-random association of a given characteristic with immune-cluster. **B.** Heatmap showing row-scaled relative levels of immune cell infiltration in 401 pHGG ordered by immune cluster pHGG_{IC1-3}. C. Kaplan-Meier plot showing significant difference in overall survival in WT-A patients by low (< median) or high (> median) levels of CD8+T infiltration; Log-Rank, p=0.03, n=80 biologically independent samples. **D.** Kaplan-Meier plot showing significant difference in overall survival in G34 patients by low (< median) or high (> median) levels of CD4T infiltration; Log-Rank, p=0.022, n=42 biologically independent samples.

Supplementary Figure 11: Estimated proportions of monocyte signature attributable to microglia in pHGG. A. Boxplot showing the estimated proportion of the total monocyte expression signature attributable to microglia in 36 biologically independent pHGG samples by subgroup. Boxes represent interquartile range, centre line represents median, whiskers represent range of minima and maxima excluding outliers.

Supplementary Table 1. Data source, publication and short description of the isolation method used for samples used to create the reference signature matrix.

Supplementary Table 2. Sources of the data used for CNS tumor cohorts.

* When considering if a patient bore a MAPK pathway mutation the following genes were considered NF1(truncating frameshift/nonsense, disrupting translocation or predicted damaging missense), FGFR1 (known activating hotspot mutation), NTRK2 (translocation or tandem duplication of kinase domains), and BRAF (V600E). Mutations were either taken from or as per method described in Mackay *et al*¹¹.

Supplementary Table 3. Data used for independent validation, and with known flow cytometry measures.

Supplementary Table 4. CNS tumor type abbreviations as given in Capper *et al*² and used within our manuscript is as follows.

* Capper *et al*² dataset contains the following control tissue types: pituitary gland, anterior lobe, cerebellar hemisphere, hemispheric cortex, hypothalamus, pineal gland, pons, white matter, inflammatory tumour microenvironment and reactive tumour microenvironment. The Inflammatory tumor microenvironment and reactive tumor microenvironment were of particular interest to us as controls. Capper *et al*² write the following to describe these classes…

"The methylation class 'control tissue, inflammatory tumor microenvironment'does not represent a distinct tumor class but rather a recurrently observed profile of mixed cell types with a high leukocyte fraction (often predominant granulocytic infiltrates). This is frequently observed in highly necrotic tumours, highly necrotic other tissues or when areas of extensive haemorrhage are sampled along with the tumor tissue of interest. Tumours with a pronounced granulocytic infiltrate due to other reasons can also get an elevated score for this class.'…

"The methylation class 'control tissue, reactive tumor microenvironment' does not represent a distinct tumor class but rather a recurrently observed methylation profile of unclear status. A score for this class indicates that the extracted DNA is likely not suitable for classification by methylation profiling. The cases constituting this class are mostly low grade tumours (gangliogliomas or pilocytic astrocytomas) but also some high grade tumours. The cases share low tumor cell content and frequently show strong reactive changes (high proportion of reactive glial cell and frequently pronounced lymphocytic infiltration)."

Supplementary References

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