# **Devising ATAC-seq methods to support Mature T-Cell Neoplasms classification in clinical settings**

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**Assay for transposase-accessible chromatin sequencing** (ATAC-seq) is a simple technique to profile open chromatin regions, granting the opportunity to classify tumors on their inherited epigenetic landscape rather than a more variable final tumoral state. Following on convincing results obtained by others clustering solid tumors, we applied ATAC-seq to Mature T-cell neoplasms (MTCN), a challenging disease in which up to 30% of minor or major **diagnostic reclassifications** have been evidenced following expert review of cases. **Over a thousand hematological samples** of multiple natures and origins were sequenced and a dedicated bioinformatics pipeline was developed, gathering new insights on MTCN pathology and paving the road to fast and accurate classification of these tumors in clinical settings.

## Semi-supervised clustering and differential analysis

A cohort of **100 FACS-sorted tumor cell samples** from primary MTCN samples was used to better characterize the previously-described MTCN subtypes (FAST-ATAC protocol).

Projection of the 137 469 ATAC peaks was performed using **t-SNE** (Figure 2A), mitigating the arbitrariness of its numerous parameters by using **4 000 sets of parameters** and selecting the more consensual projection (least squares method). The **stability** of each sample could also be assessed, as the proportion of the 4 000 t-SNEs in which it had the same closest neighbors. Clustering was finally performed using an **iterative** 

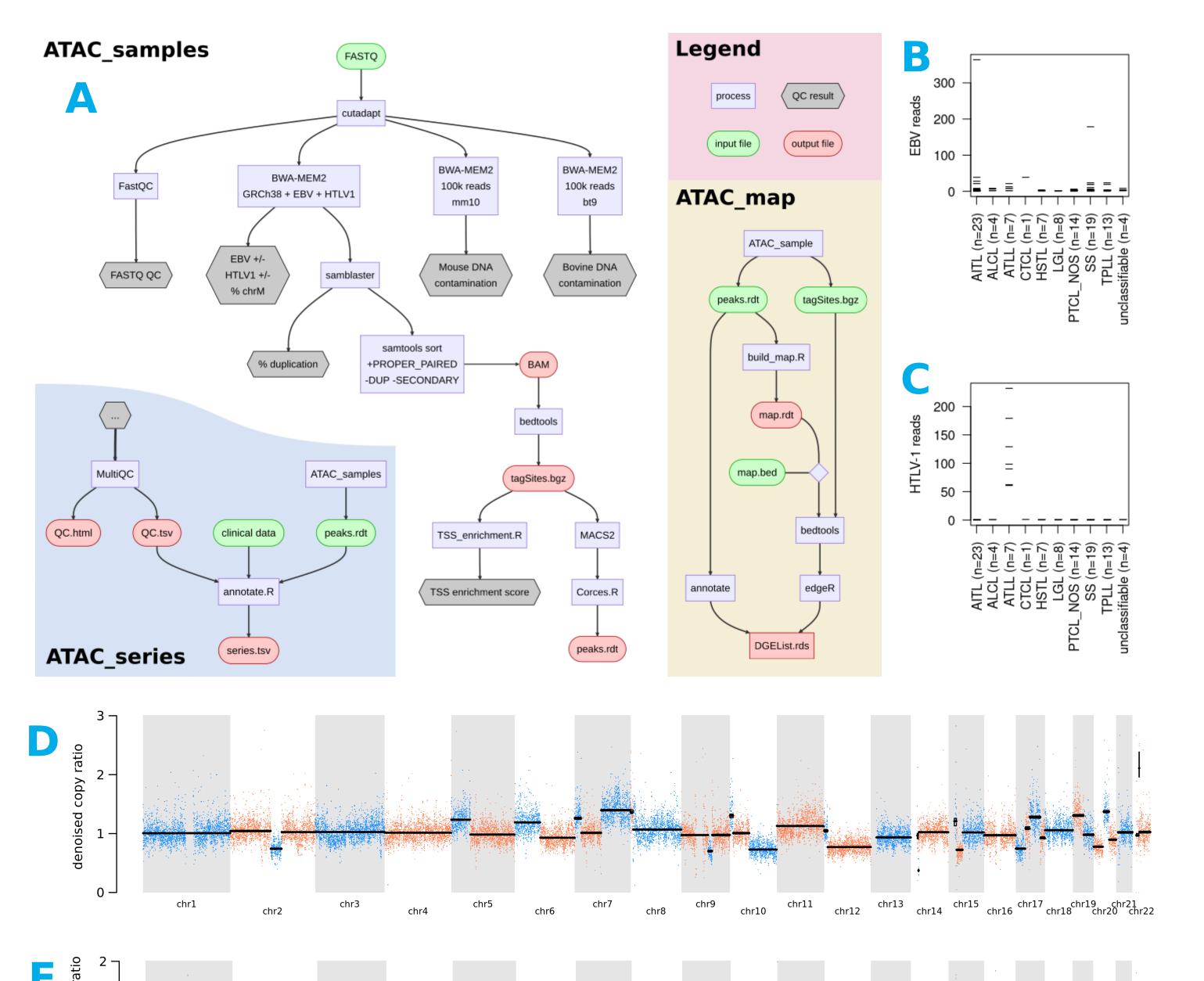
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#### **Gathering more than epigenetics data from ATAC-seq**

Capitalizing on methods published by ATAC-seq inventors and the ENCODE project, we developed a **Singularity-backed Nextflow pipeline** (Figure 1A) which proved **6.5 times faster than ENCODE's** in our setting (from 25.1 h / 717.5 CPUh to 3.9 h / 99.5 CPUh on a 16-sample run of 442e6 read pairs), while providing similar results and additional functionalities.

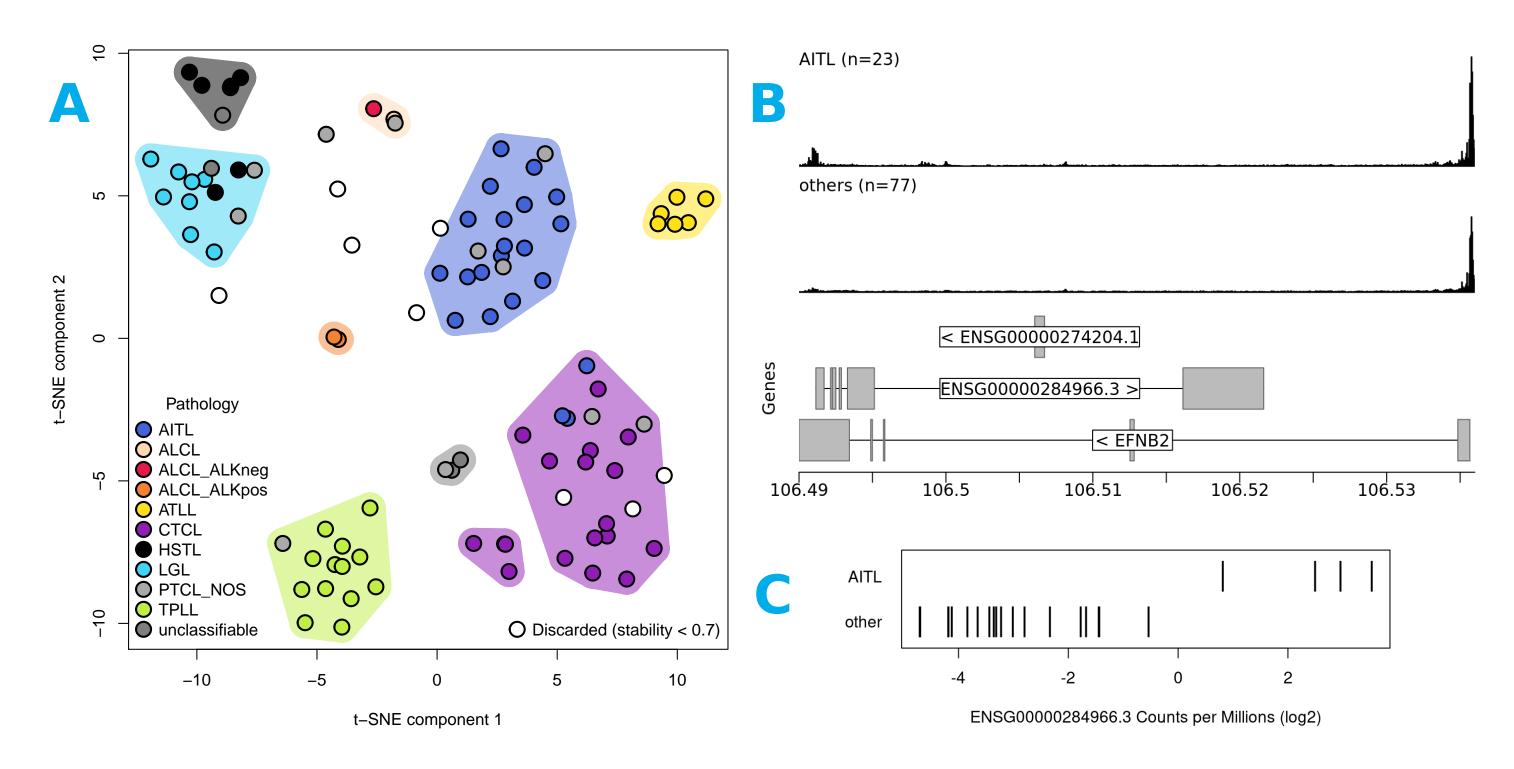
Extra quality checks include a generic framework to **quantify DNA contamination from other species**, as poor quality samples tended to display bovine contamination from cell culture medium. This framework could be extended to quantify **latent viral and retroviral integration in genomes** (Figures 1B and 1C), which can contribute to classification (7/7 acute T-cell leukemia / lymphomas, a subtype associated with HTLV-1 infection, were positive).

ATAC-seq also provides the opportunity to identify **large copy-number alterations**, using GATK ModelSegments on out-of-peak reads. While sample quality was not always sufficient to obtain clean profiles (Figure 1D), this proved useful to identify iso(7q) (Figure 1E), whose association with hepatosplenic T-cell lymphoma is well-documented.



# **nearest-neighbor joining strategy**, a method particularly tolerant to clusters of heterogeneous sizes (Figure 2A).

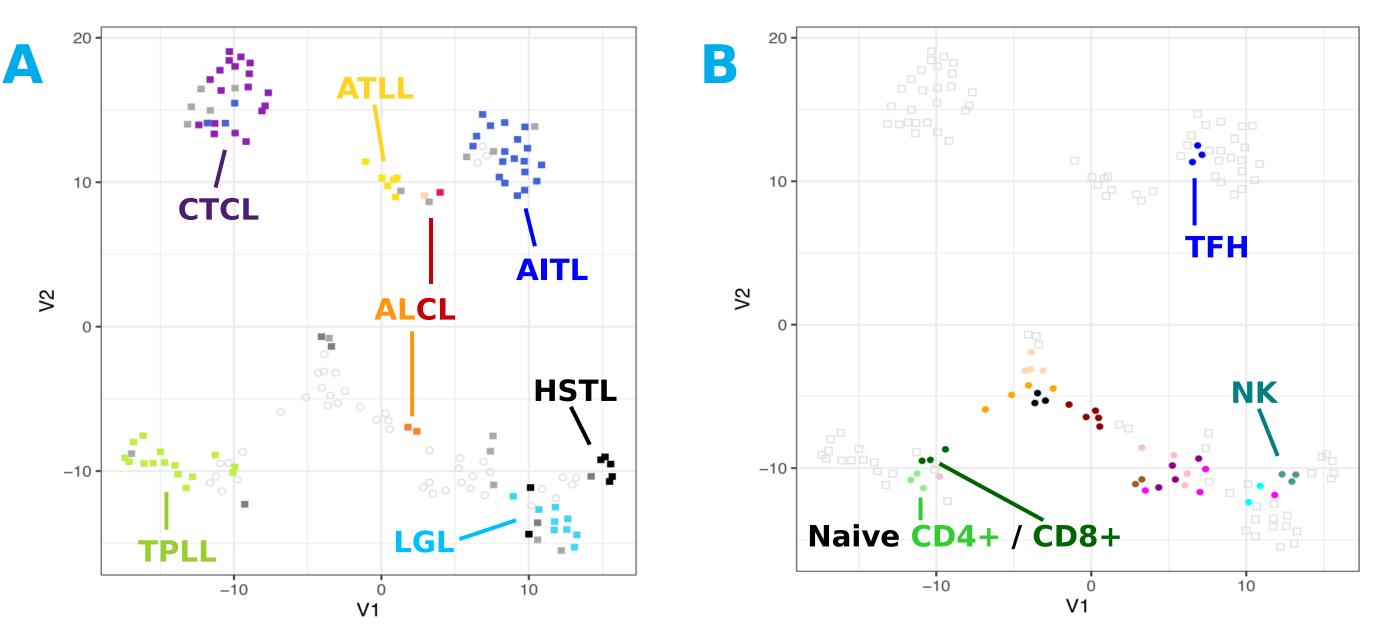
**Differential opening analysis** between the resulting clusters could pinpoint several markers of interest, such as *EFNB2* in angioimmunoblastic T-cell lymphoma (AITL). The significant peak was actually located at the promoter of an antisens IncRNA (Figure 2B), whose expression was indeed impacted in additional RNA-seq data (Figure 2C).



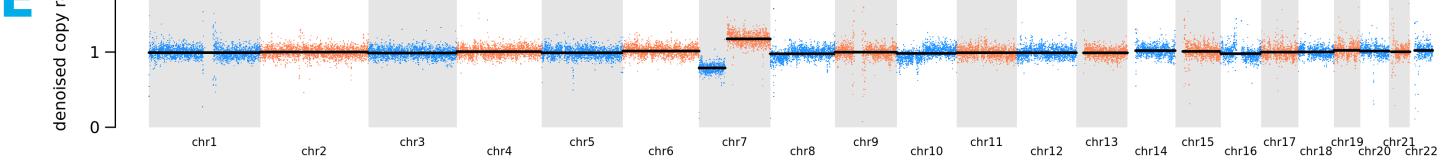
**Figure 2 : A** : t-SNE projection and clustering of 100 FACS-sorted MTCN samples. **B** : Cumulated ATAC-seq profiles of AITL and non-AITL samples along *EFNB2* gene locus. **C** : RNA-seq expression levels of ENSG00000284966.3, a lncRNA antisens to *EFNB2* in a subset of ATAC samples.

### Joint clustering with normals reveals cells-of-origin

Joint UMAP projection and clustering with sorted normal cell samples could also fuel the current discussion over possible cells-of-origin for the various MTCN subtypes, notably naive T-cells for prolymphocytic leukemia (TPLL), an entity previously believed to be derived from memory T-cells (Figure 3).



**Figure 3 :** UMAP projection of 100 FACS-sorted tumor cell samples (**A**) and 73 FACS-sorted normal hematological cell samples (**B**). Samples were projected together and represented separately.



**Figure 1 : A** : Schematic representation of the 3 Nextflow pipelines (inputs in green, outputs in red, processes in purple and QCs in gray). **B** and **C** : ATAC-seq reads mapped to HTLV-1 (Human T-Lymphotropic Virus 1) and EBV (Epstein–Barr Virus) in the 100 FACS-sorted MTCN samples. **D** : DNA copy-number profile derived from ATAC-seq. **E** : Iso-chromosome 7q identified by ATAC-seq.

ATAC-seq provided robust classification and novel insights in MTCN, and tools are fast and accurate enough to perform in a clinical setting while benefiting from ATAC-seq simplicity and cost-efficiency. Latest protocols suitable for paraffin-embedded samples, currently under investigation, could make ATAC-seq a key player in MTCN, and other cancers, diagnosis.

