

# Supplementary : data analysis methods

April 1, 2024

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## 1 Quality control

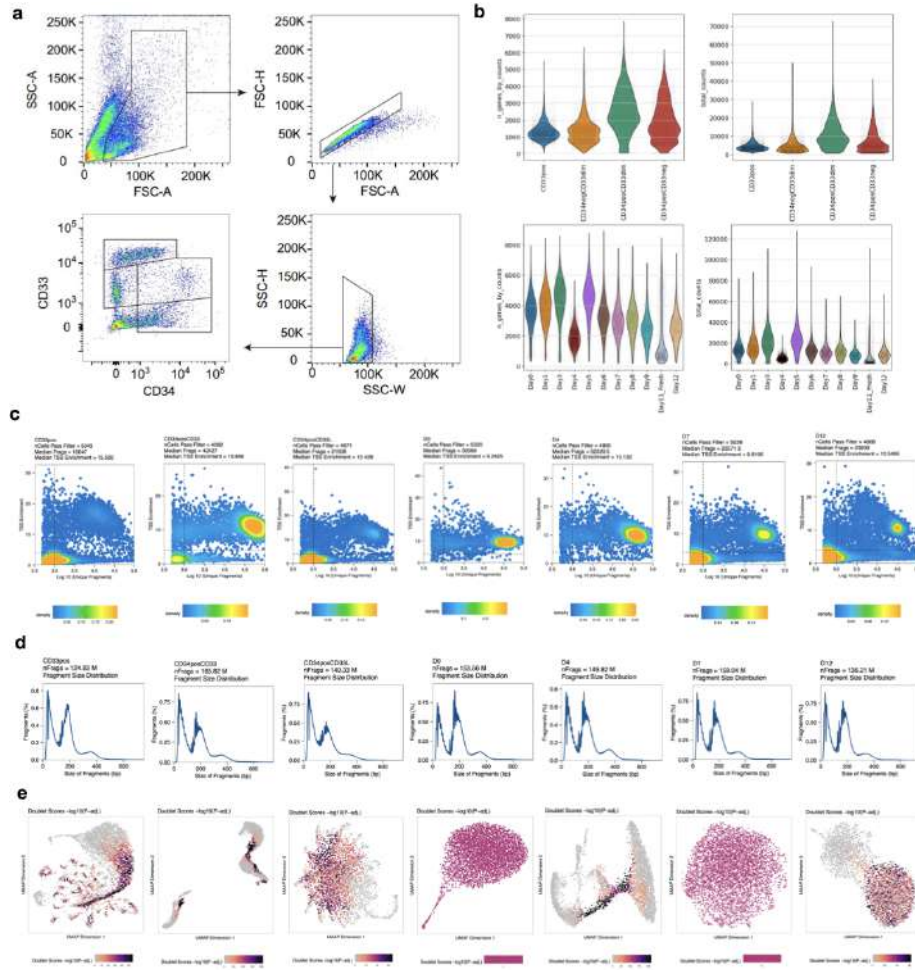


Figure 1: Supplementary: a. Gating strategy used for FACS sorting on human bone marrow cells. b. Quality control for RNA samples. Violin plots show the number of non-zero genes and total counts per cell for indivudla samples (top for sorted samples, bottom for timepoints samples). c,d,e. Quality control for ATAC samples: TSS by unique fragments, fragment size distribution, doublet scores

## 2 Cell type annotation

### 2.1 Scatter plots

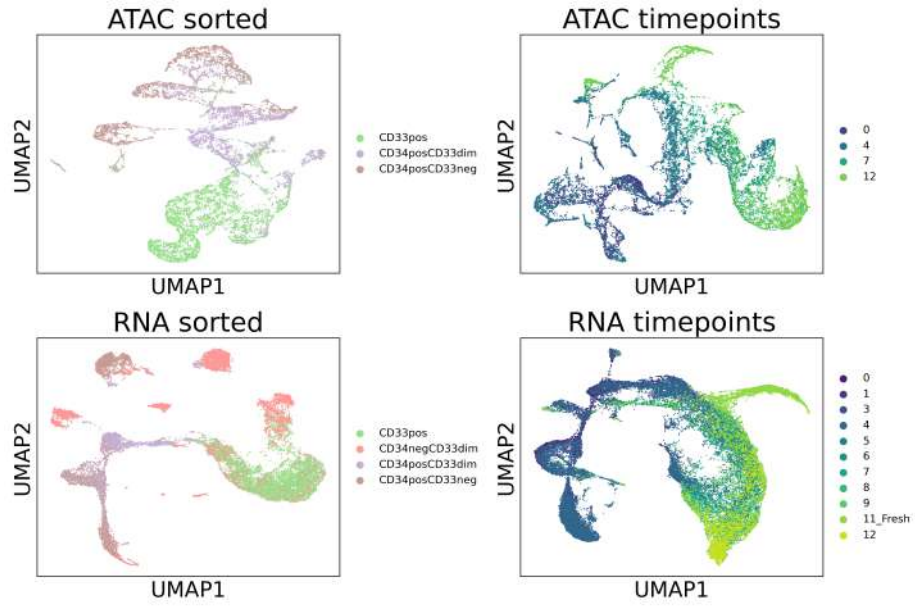


Figure 2: Supplementary: Time points (days) and sorted assays (CD) annotation

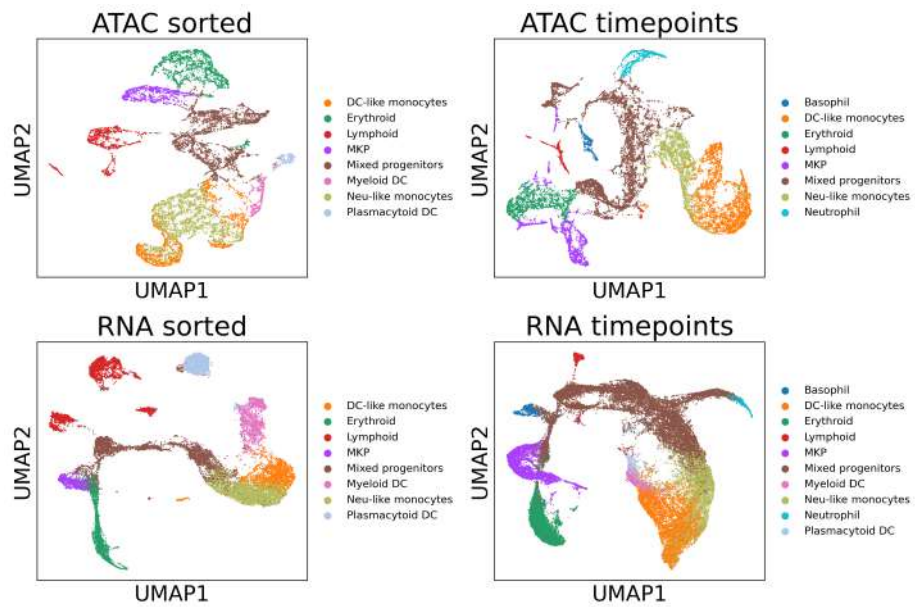


Figure 3: Supplementary: Leiden identity simple annotation

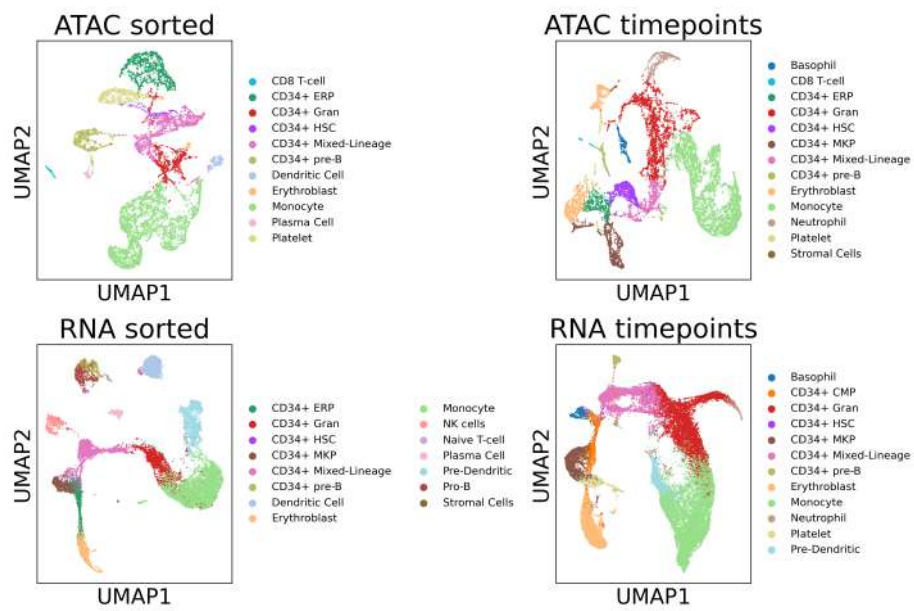


Figure 4: Supplementary: Leiden identity annotation

## 2.2 Bar plots

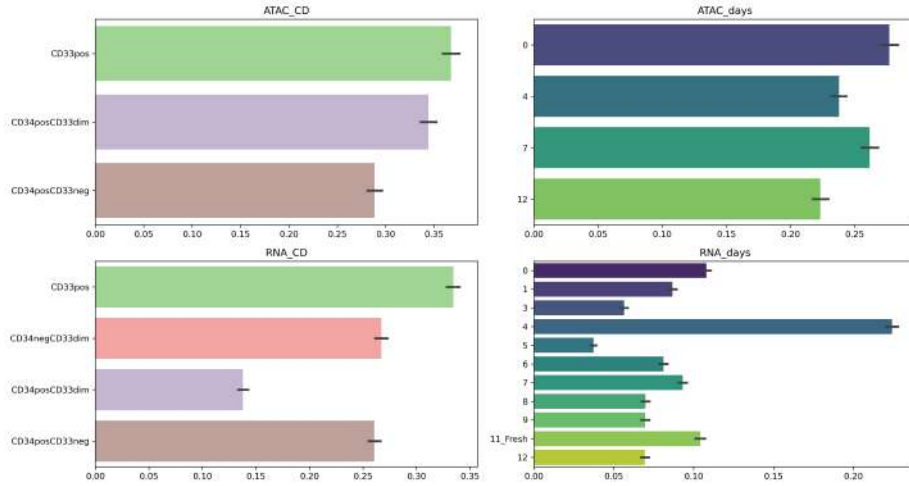


Figure 5: Supplementary: Leiden identity simple annotation

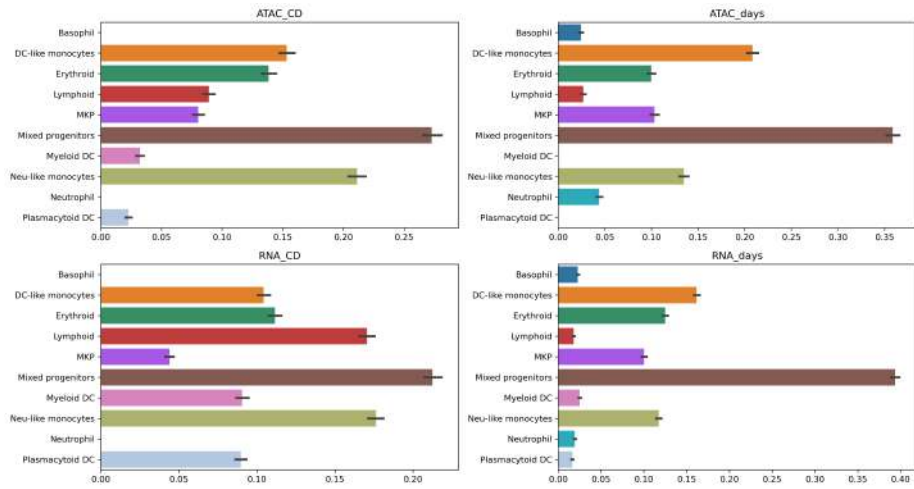


Figure 6: Supplementary: Leiden identity simple annotation

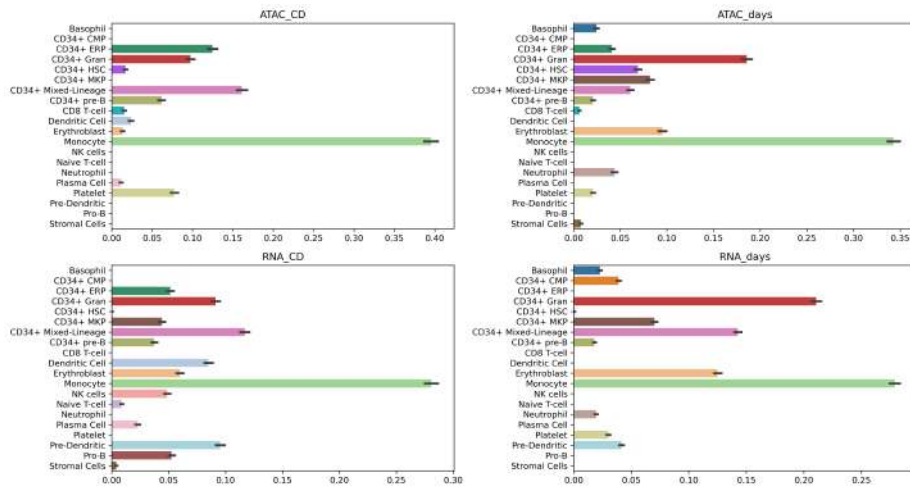


Figure 7: Supplementary: Leiden identity annotation

## 2.3 Correlation plots

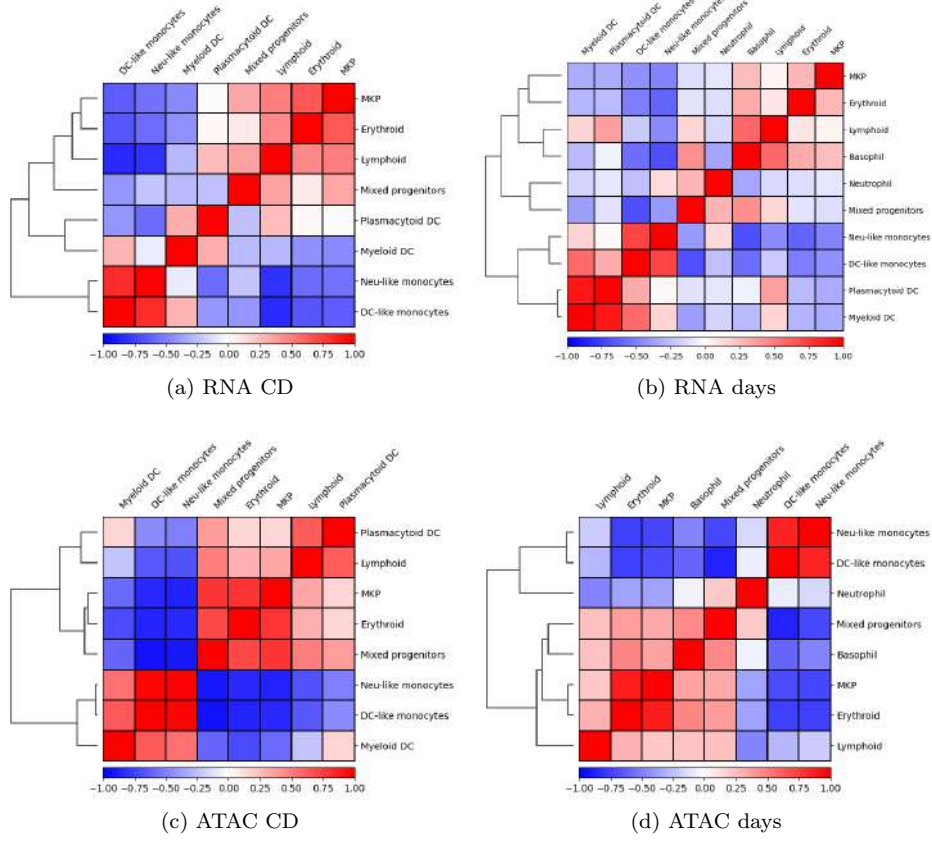


Figure 8: Correlation between cell type averages (obtained using top PCs)

### 3 Data integration

#### 3.1 Linear optimal transport

##### 3.1.1 Scatter plots

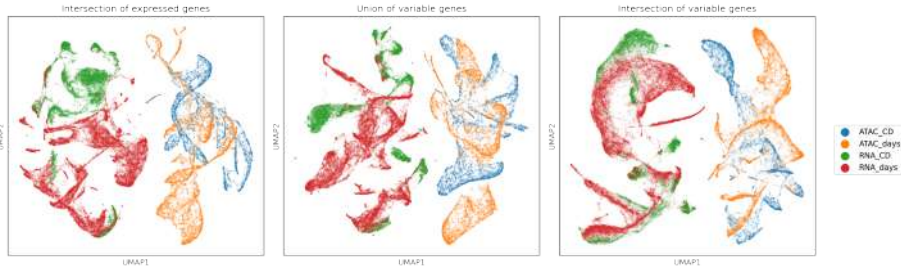


Figure 9: Assays in RNA days PCA subspace



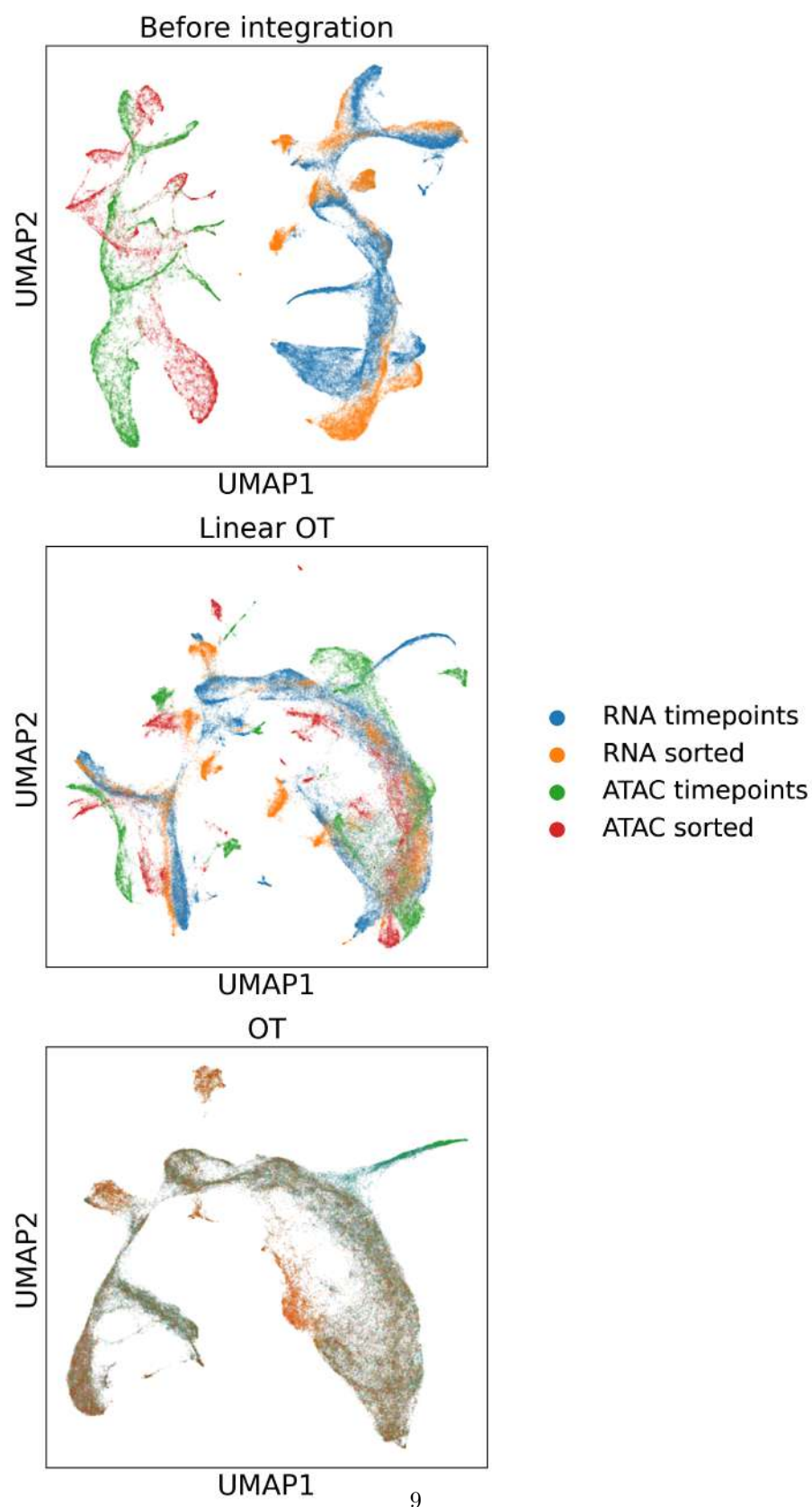


Figure 10: Assays in RNA days PCA subspace, after alignment with linear optimal transport

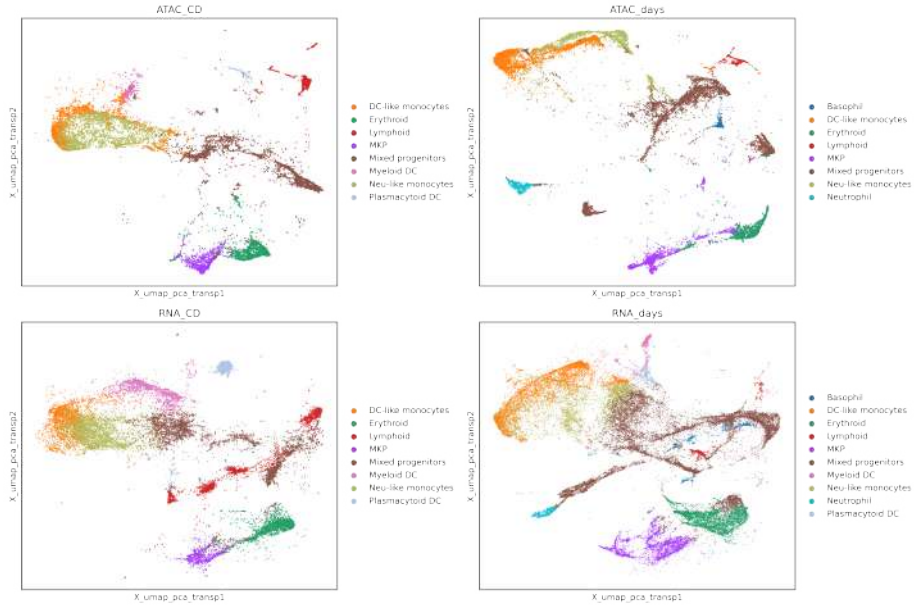


Figure 11: Assays in RNA days PCA subspace obtained using the intersection of expressed genes, after alignment with linear optimal transport.

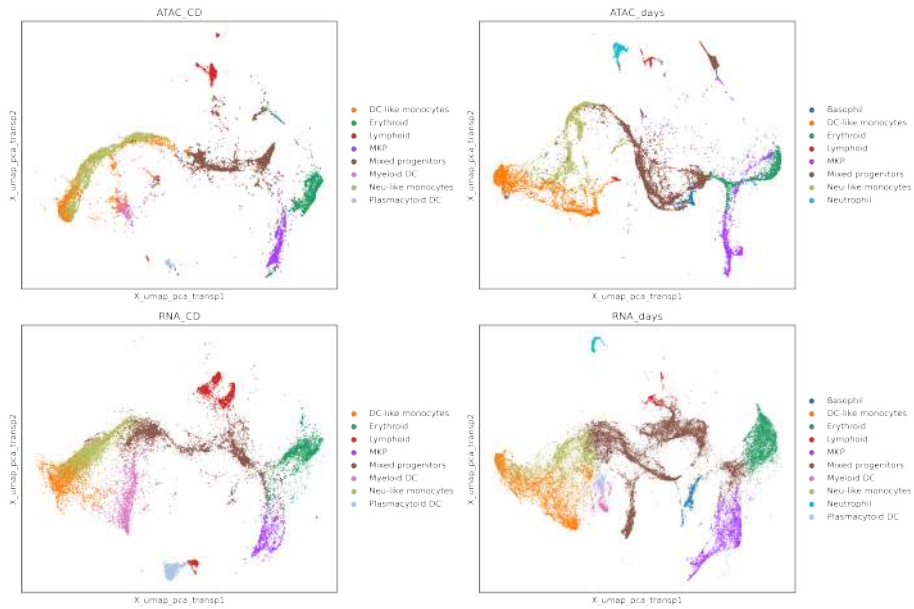


Figure 12: Assays in RNA days PCA subspace obtained using the union of variable genes, after alignment with linear optimal transport.

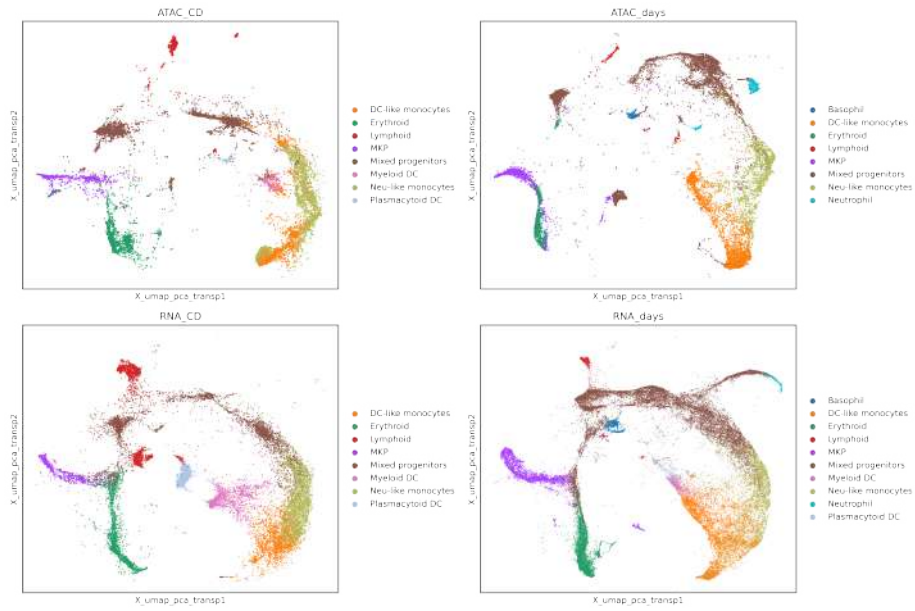


Figure 13: Assays in RNA days PCA subspace obtained using the intersection of variable genes, after alignment with linear optimal transport.

### 3.1.2 Correlation plots

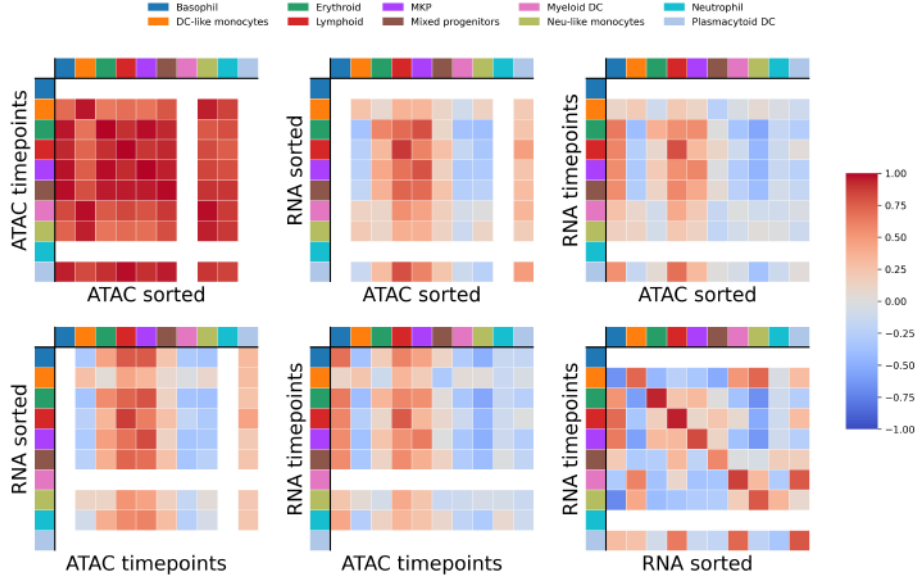


Figure 14: Correlation between assays' cell type averages (obtained using top PCs of assays, each in their own PCA subspace)

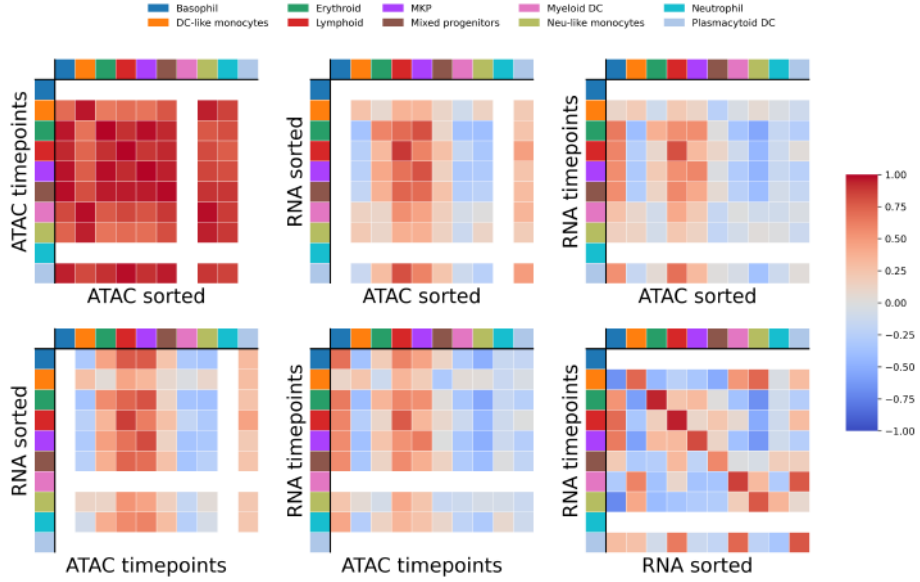


Figure 15: Correlation between assays' cell type averages (obtained using top PCs of assays in RNA days PCA subspace)

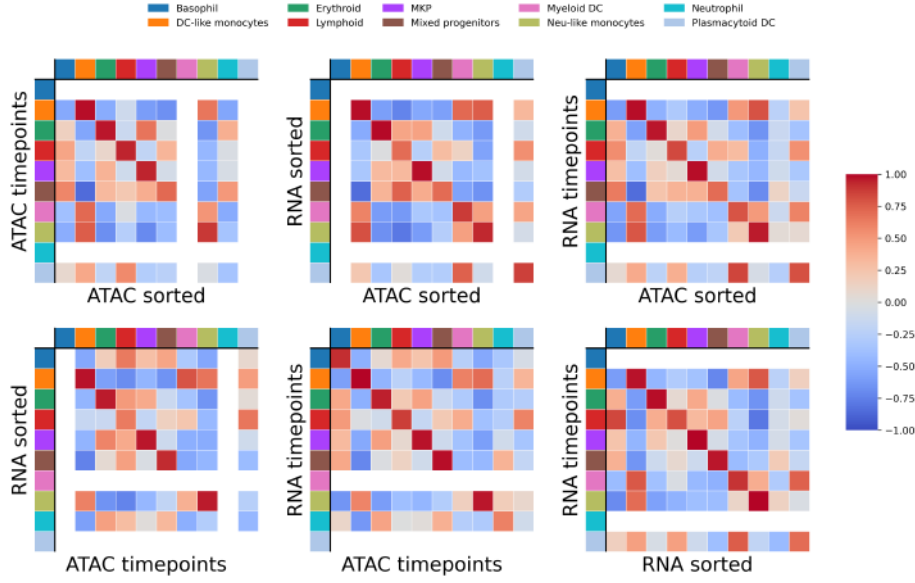


Figure 16: Correlation between assays' cell type averages (obtained using top PCs of assays in RNA days PCA subspace, after alignment with linear optimal transport)

### 3.2 Supervised optimal transport

#### Grouping of categories to go from full to simple annotation

- 'Early-ERP', 'Erythroblast', 'CD34+ ERP' = 'Erythroid'
- 'Platelet', 'CD34+ MKP' = 'MKP'
- 'Pre-Dendritic', 'Dendritic Cell' = 'Dendritic'
- 'CD34+ CLP', 'CD34+ pre-B', 'Pro-B', 'Plasma Cell', 'NK cells', 'Naive T-cell', 'CD8 T-cell' = 'Lymphoid'
- 'CD34+ Mixed-Lineage', 'CD34+ HSC', 'CD34+ CMP', 'CD34+ Gran', 'Eosinophil', 'Stromal Cells' = 'Mixed-Lineage'
- change unlikely 'Erythroid' annotation (outlier, mixed cluster) for late ATAC days (day 7 and 12) to 'Mixed-Lineage'

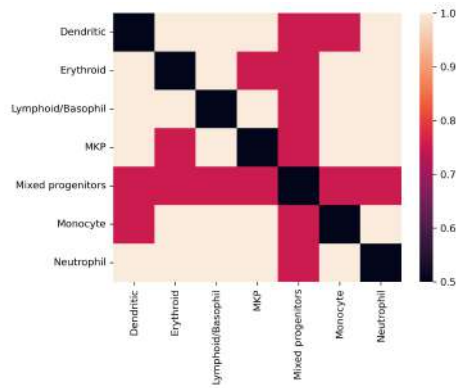


Figure 17: Supplementary: supervision of OT cost matrix

## 4 HSC score

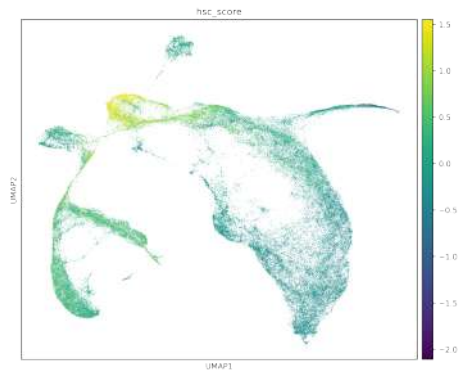


Figure 18: Supplementary: hematopoietic stem cell score

## 5 Trajectory inference

### 5.1 Trajectory in PCA space

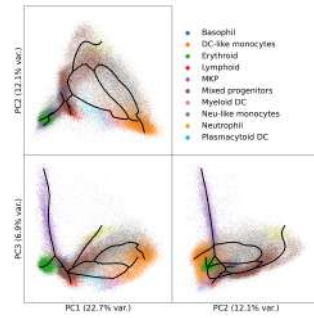


Figure 19: Supplementary: Trajectory visualized in PCA space

## 6 Trajectory analysis

### 6.1 Erythroid branch

#### 6.1.1 Pseudotime

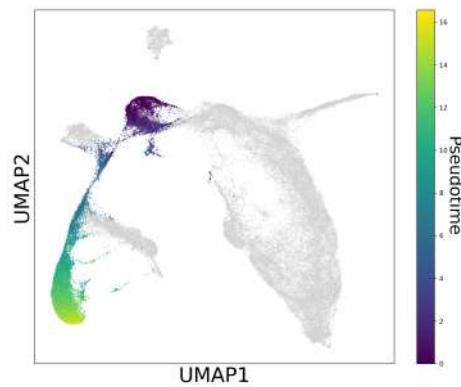


Figure 20: Supplementary: Erythroid branch pseudotime

#### 6.1.2 Volcanos

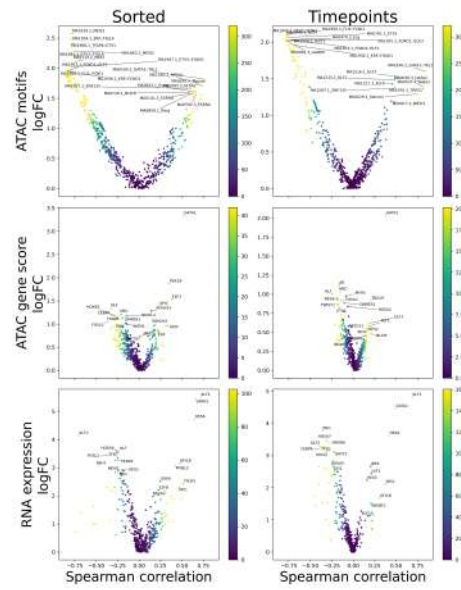


Figure 21: Supplementary: Erythroid branch marker detection with Spearman correlation. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

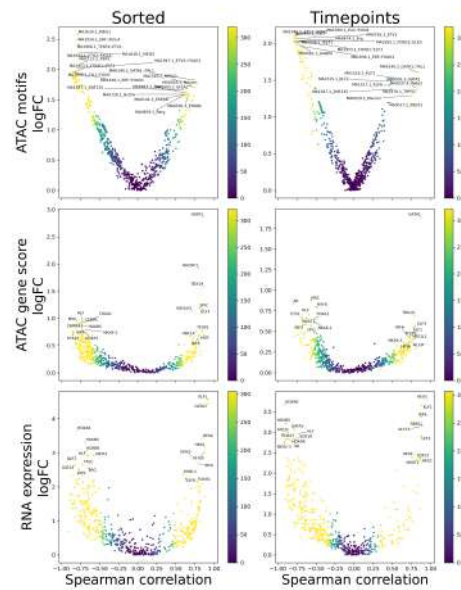


Figure 22: Supplementary: Erythroid branch marker detection with Spearman correlation and MAGIC imputed matrices for gene score and RNA expression. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

### 6.1.3 Heatmap



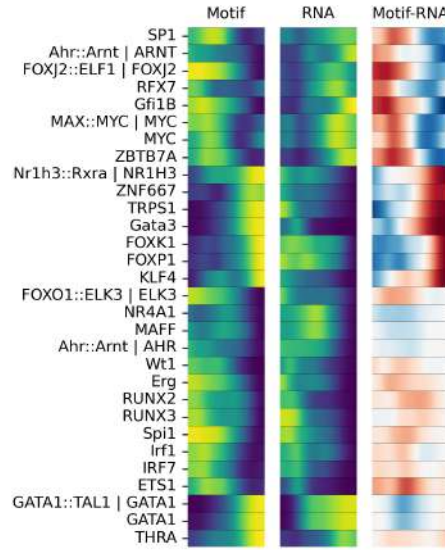


Figure 23: Supplementary: Heatmap of top negative and positive correlations against pseudotime, grouping all RNA and chromVAR assays

#### 6.1.4 X plots

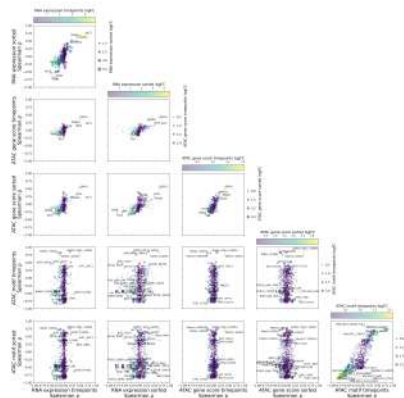


Figure 24: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays

## 6.2 MKP branch

### 6.2.1 Pseudotime

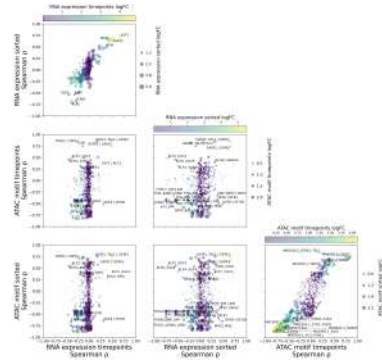


Figure 25: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score

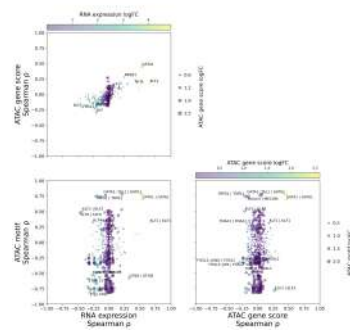


Figure 26: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays

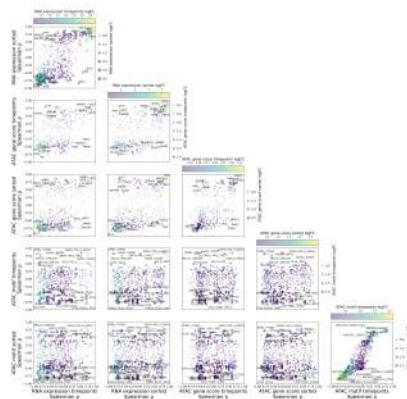


Figure 27: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays, with MAGIC smoothing for gene score and RNA expression

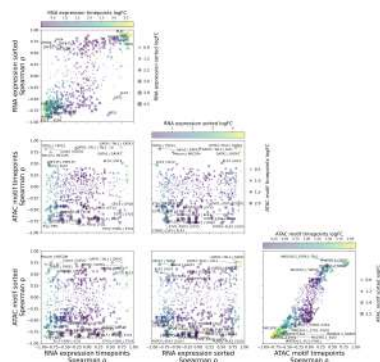


Figure 28: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score, with MAGIC smoothing for gene score and RNA expression

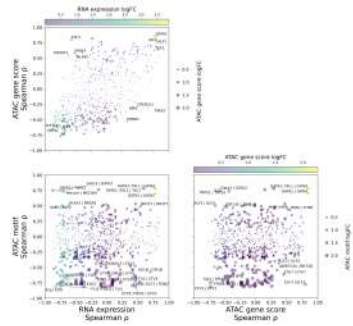


Figure 29: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays with MAGIC smoothing for gene score and RNA expression

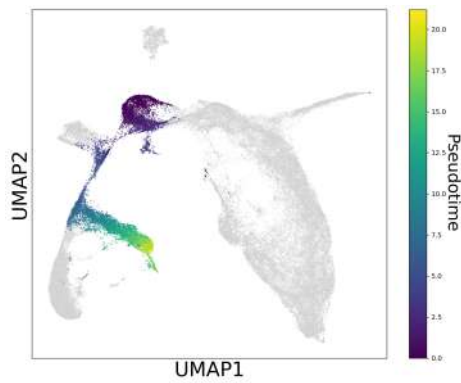


Figure 30: Supplementary: MKP branch pseudotime

## 6.2.2 Volcanos

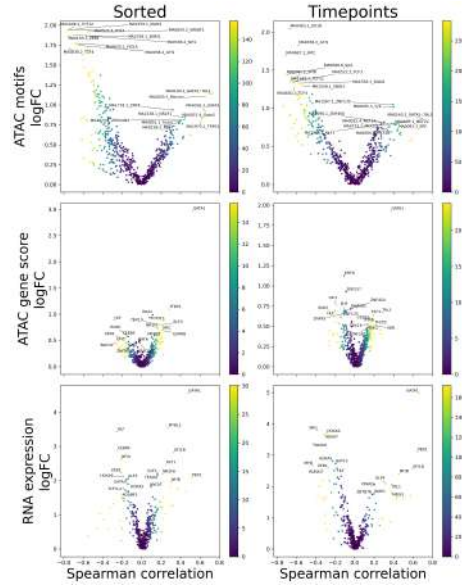


Figure 31: Supplementary: Erythroid branch marker detection with Spearman correlation. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

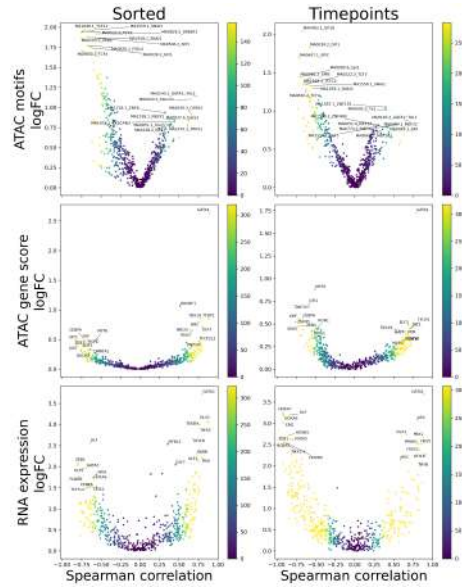


Figure 32: Supplementary: Erythroid branch marker detection with Spearman correlation and MAGIC imputed matrices for gene score and RNA expression. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

### 6.2.3 Heatmap

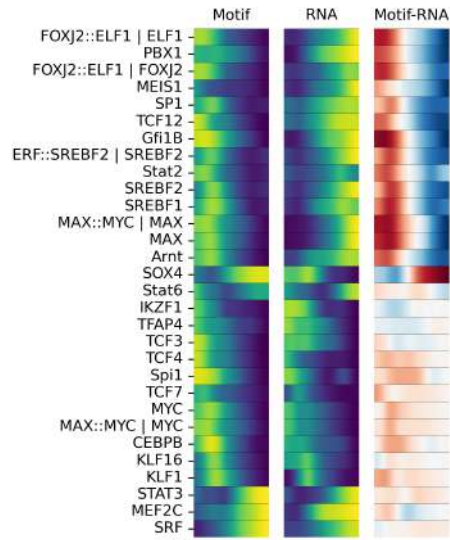


Figure 33: Supplementary: Heatmap of top negative and positive correlations against pseudotime, grouping all RNA and chromVAR assays

### 6.2.4 X plots

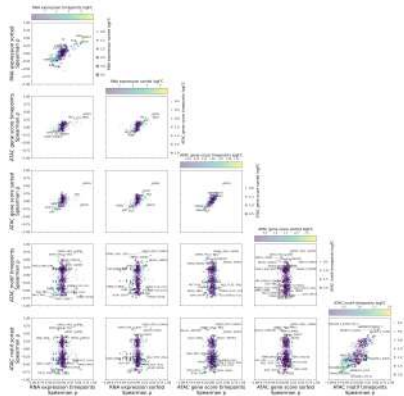


Figure 34: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays

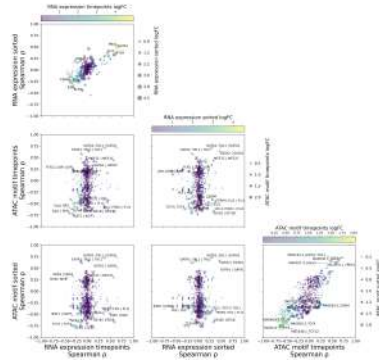


Figure 35: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score

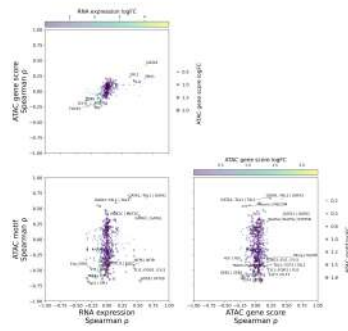


Figure 36: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays

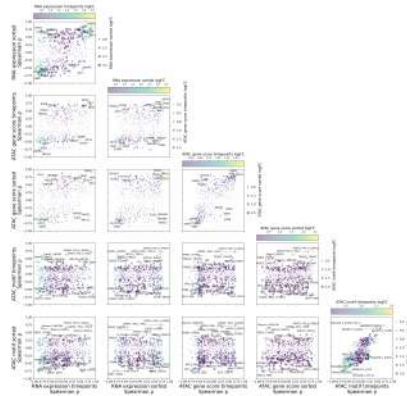


Figure 37: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays, with MAGIC smoothing for gene score and RNA expression

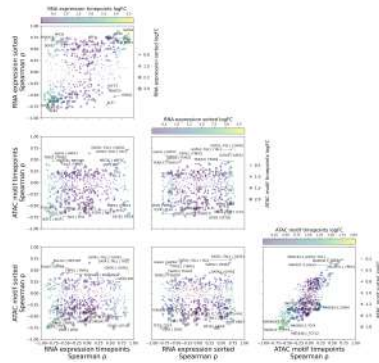


Figure 38: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score, with MAGIC smoothing for gene score and RNA expression



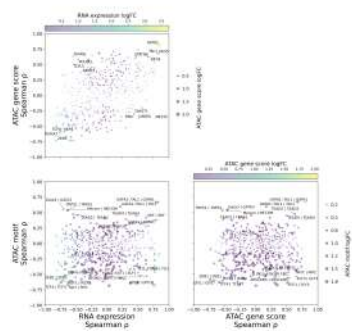


Figure 39: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays with MAGIC smoothing for gene score and RNA expression

## 6.3 Basophil branch

### 6.3.1 Pseudotime

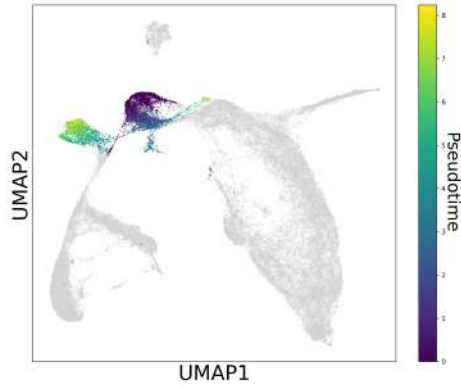


Figure 40: Supplementary: MKP branch pseudotime

### 6.3.2 Volcanos

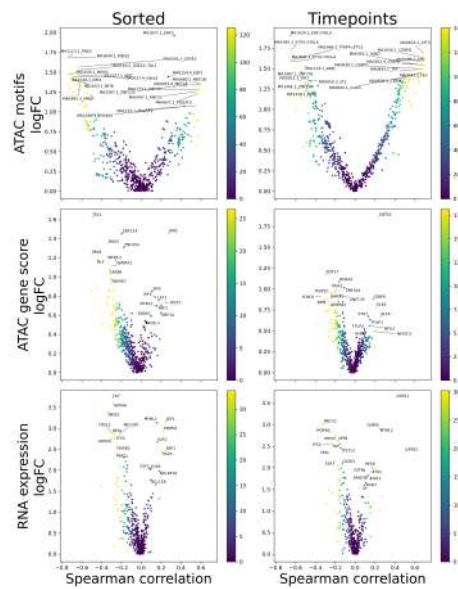


Figure 41: Supplementary: Erythroid branch marker detection with Spearman correlation. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

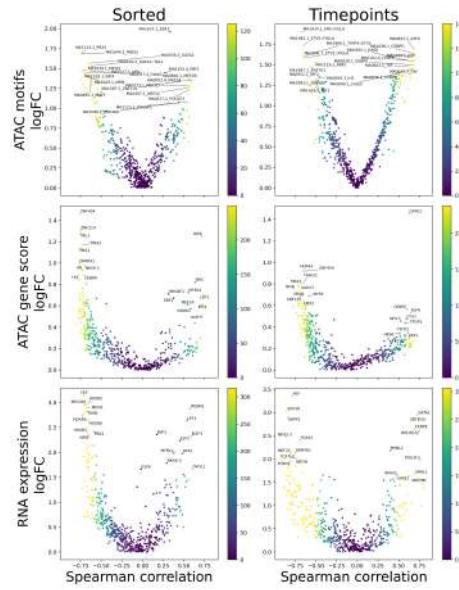


Figure 42: Supplementary: Erythroid branch marker detection with Spearman correlation and MAGIC imputed matrices for gene score and RNA expression. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

### 6.3.3 Heatmap

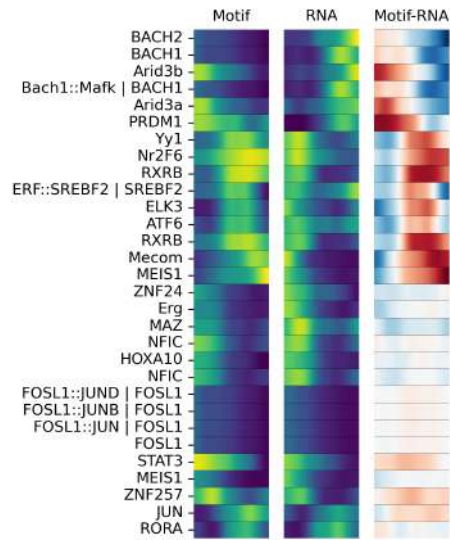


Figure 43: Supplementary: Heatmap of top negative and positive correlations against pseudotime, grouping all RNA and chromVAR assays

### 6.3.4 X plots

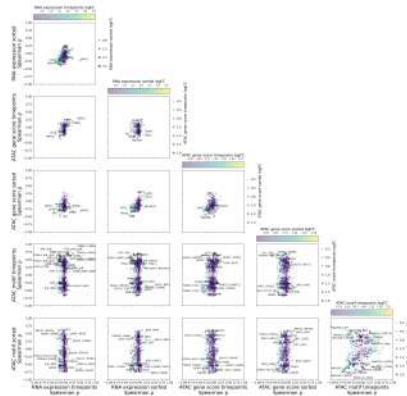


Figure 44: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays

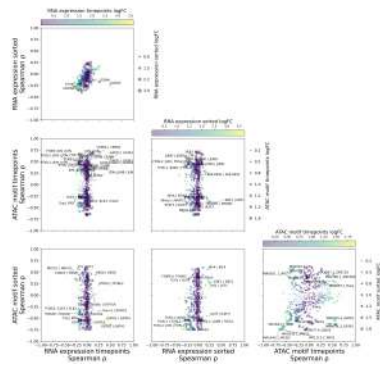


Figure 45: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score

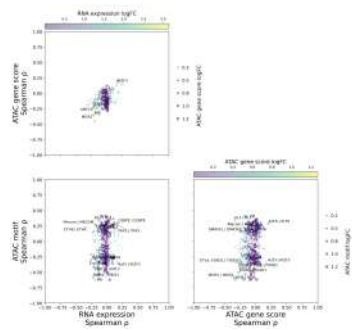


Figure 46: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays

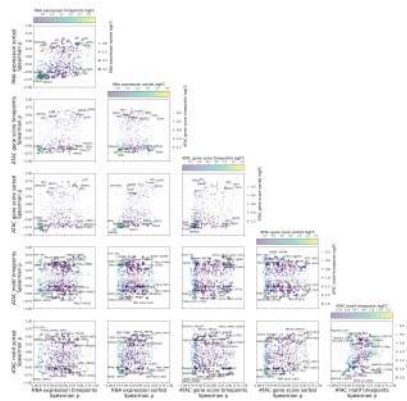


Figure 47: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays, with MAGIC smoothing for gene score and RNA expression

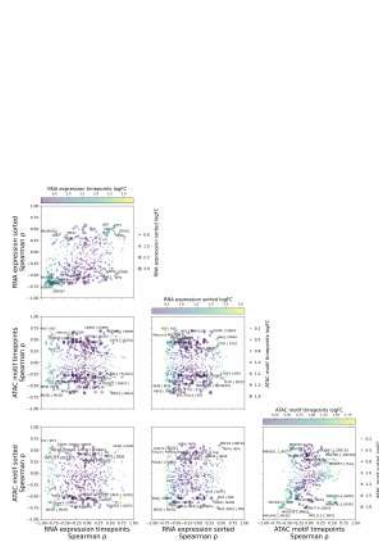


Figure 48: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score, with MAGIC smoothing for gene score and RNA expression

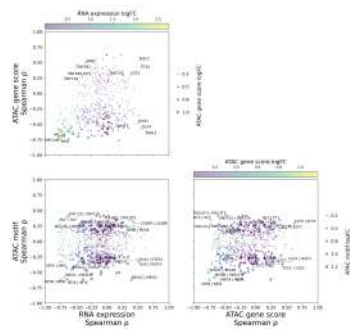


Figure 49: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays with MAGIC smoothing for gene score and RNA expression

## 6.4 Neutrophil branch

### 6.4.1 Pseudotime

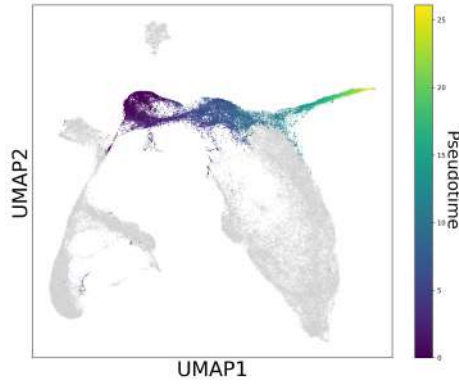


Figure 50: Supplementary: MKP branch pseudotime

### 6.4.2 Volcanos

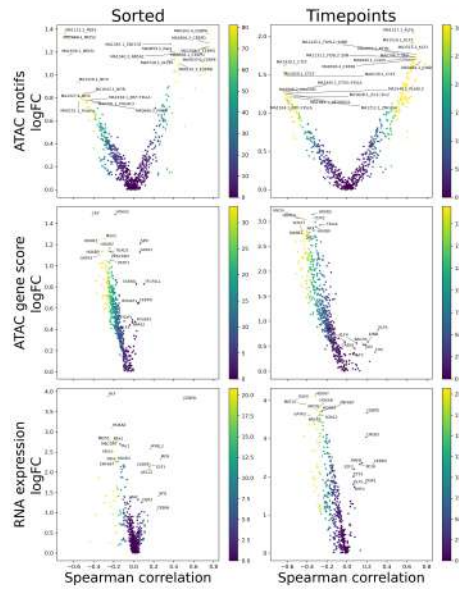


Figure 51: Supplementary: Erythroid branch marker detection with Spearman correlation. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

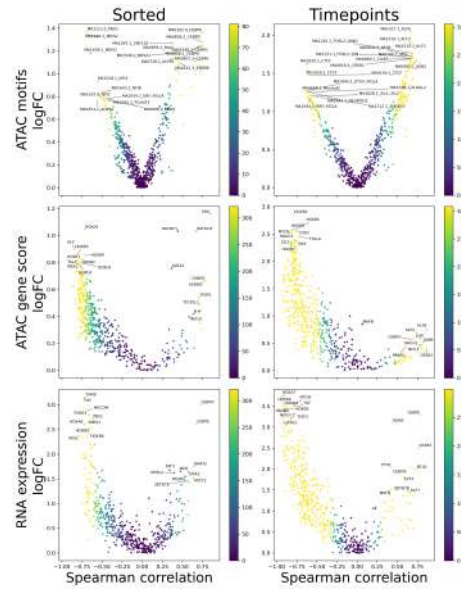


Figure 52: Supplementary: Erythroid branch marker detection with Spearman correlation and MAGIC imputed matrices for gene score and RNA expression. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

#### 6.4.3 Heatmap

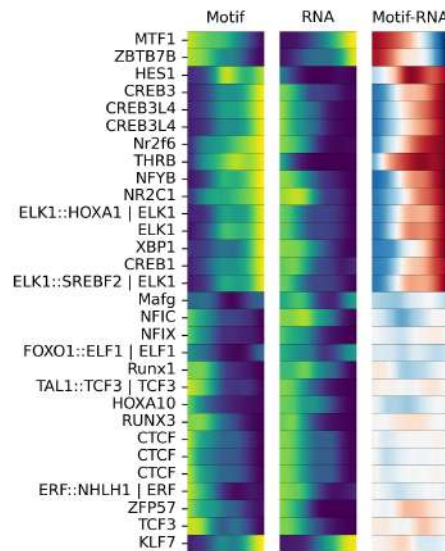


Figure 53: Supplementary: Heatmap of top negative and positive correlations against pseudotime, grouping all RNA and chromVAR assays



#### 6.4.4 X plots

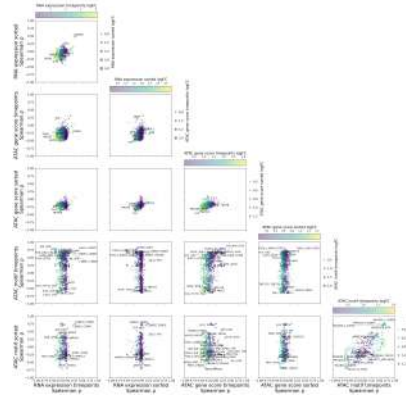


Figure 54: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays

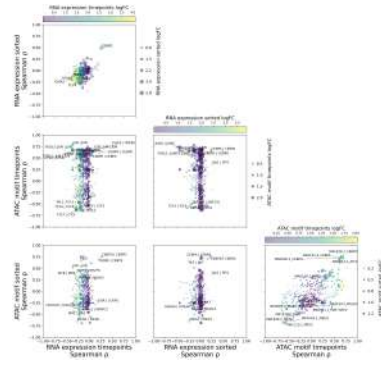


Figure 55: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score

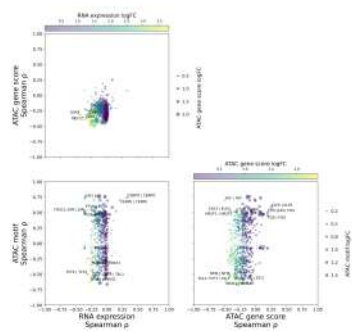


Figure 56: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays

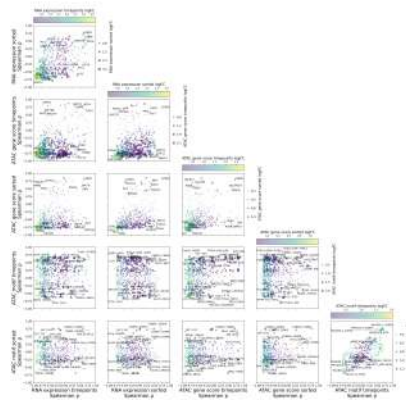


Figure 57: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays, with MAGIC smoothing for gene score and RNA expression

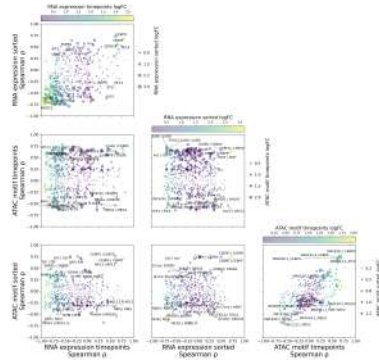


Figure 58: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score, with MAGIC smoothing for gene score and RNA expression

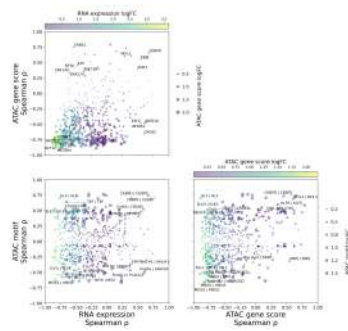


Figure 59: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays with MAGIC smoothing for gene score and RNA expression

## 6.5 Monocyte branch

### 6.5.1 Pseudotime

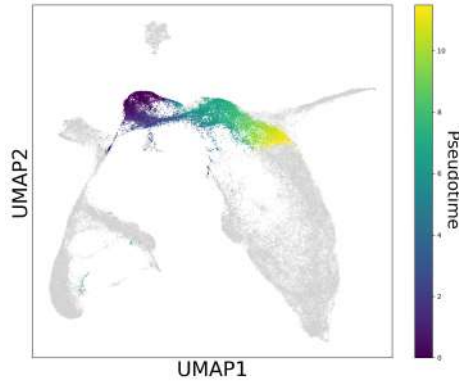


Figure 60: Supplementary: MKP branch pseudotime

### 6.5.2 Volcanos

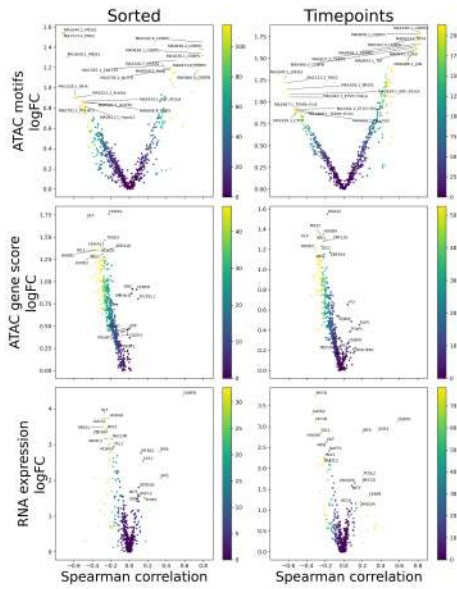


Figure 61: Supplementary: Erythroid branch marker detection with Spearman correlation. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

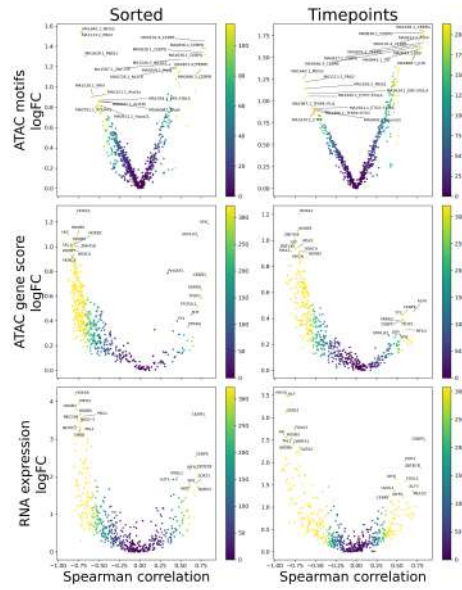


Figure 62: Supplementary: Erythroid branch marker detection with Spearman correlation and MAGIC imputed matrices for gene score and RNA expression. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

### 6.5.3 Heatmap

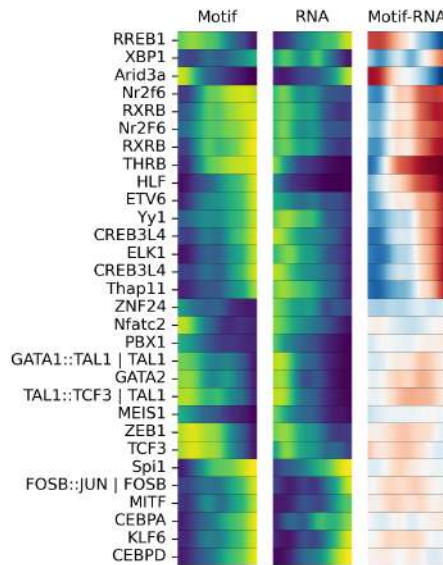


Figure 63: Supplementary: Heatmap of top negative and positive correlations against pseudotime, grouping all RNA and chromVAR assays

### 6.5.4 X plots

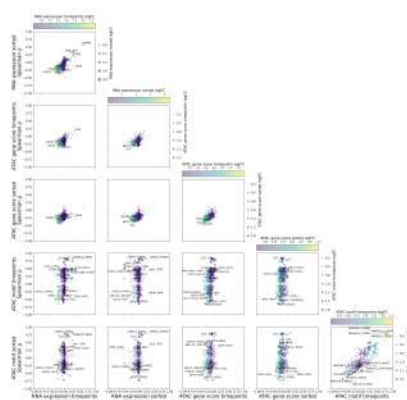


Figure 64: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays

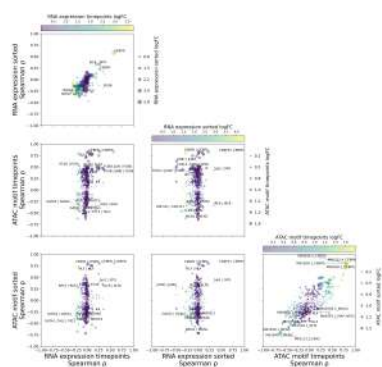


Figure 65: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score

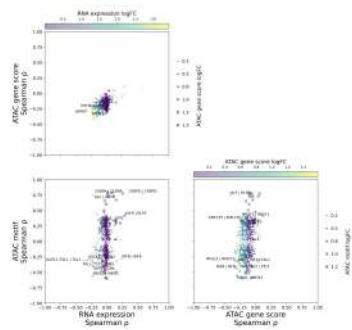


Figure 66: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays

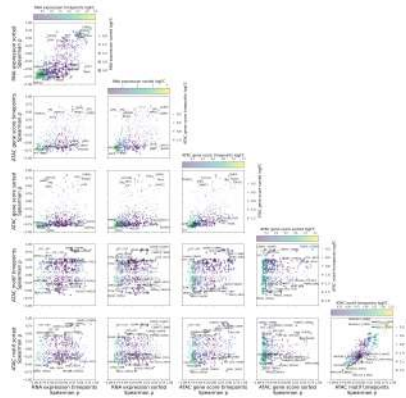


Figure 67: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays, with MAGIC smoothing for gene score and RNA expression

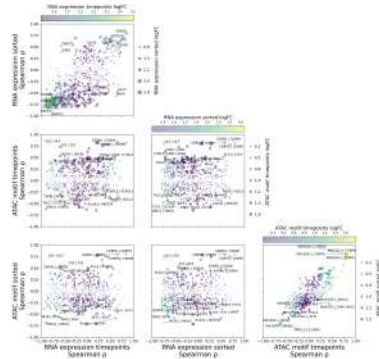


Figure 68: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score, with MAGIC smoothing for gene score and RNA expression

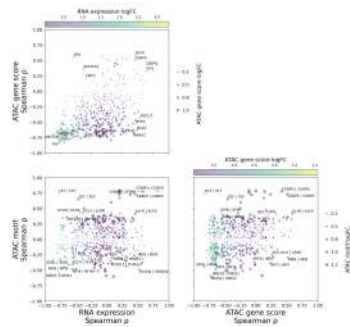


Figure 69: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays with MAGIC smoothing for gene score and RNA expression



## 6.6 Myeloid DC branch

### 6.6.1 Pseudotime

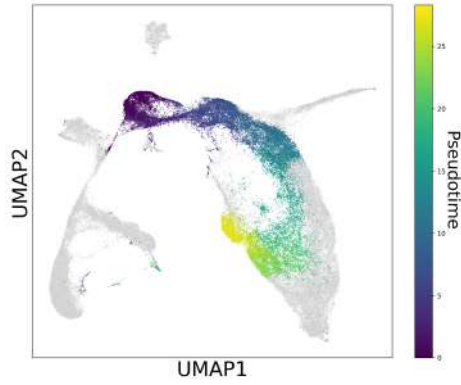


Figure 70: Supplementary: MKP branch pseudotime

### 6.6.2 Volcanos

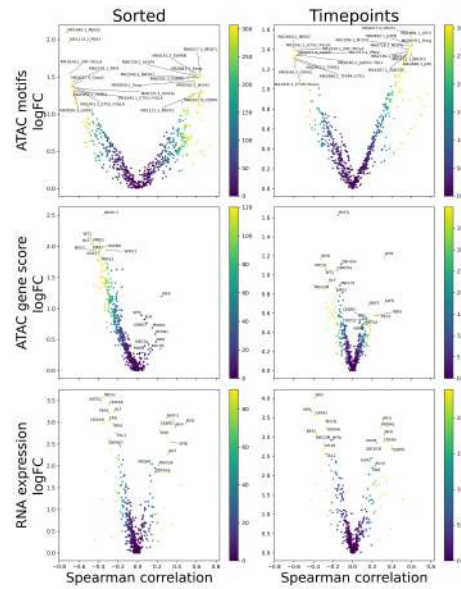


Figure 71: Supplementary: Erythroid branch marker detection with Spearman correlation. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

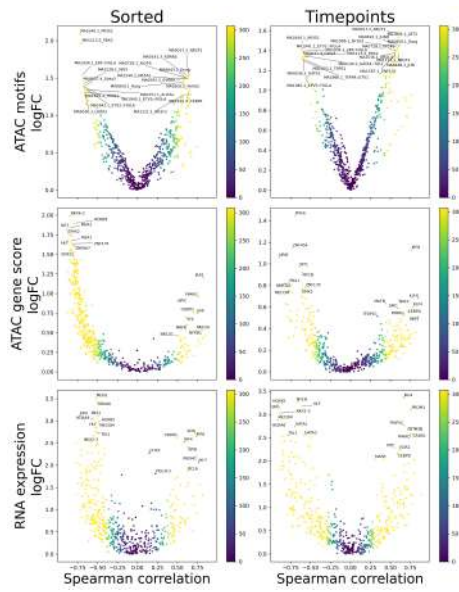


Figure 72: Supplementary: Erythroid branch marker detection with Spearman correlation and MAGIC imputed matrices for gene score and RNA expression. The volcano plot is colored by  $-\log_{10}$  adjusted p-values

### 6.6.3 Heatmap

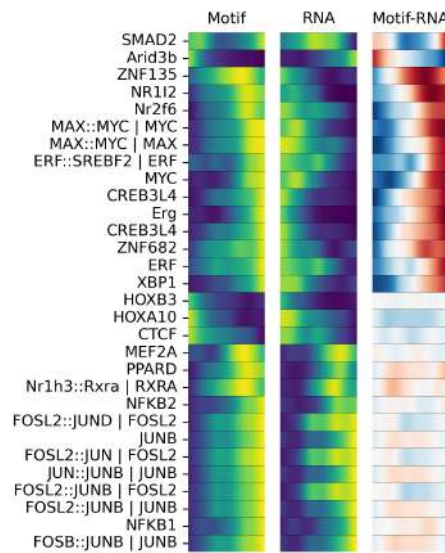


Figure 73: Supplementary: Heatmap of top negative and positive correlations against pseudotime, grouping all RNA and chromVAR assays

#### 6.6.4 X plots

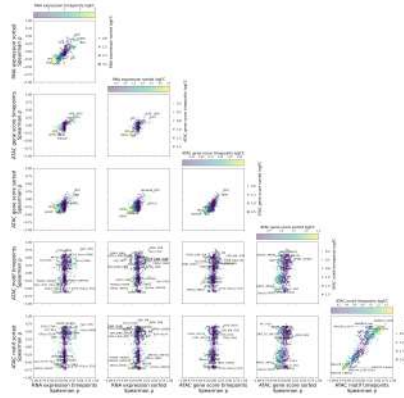


Figure 74: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays

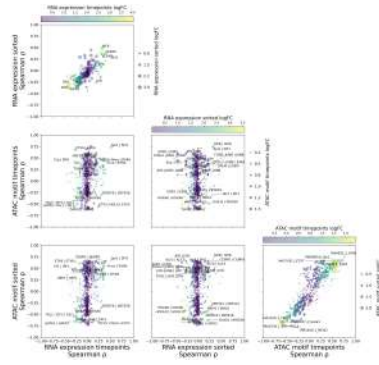


Figure 75: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score

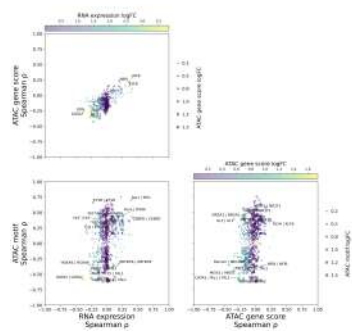


Figure 76: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays

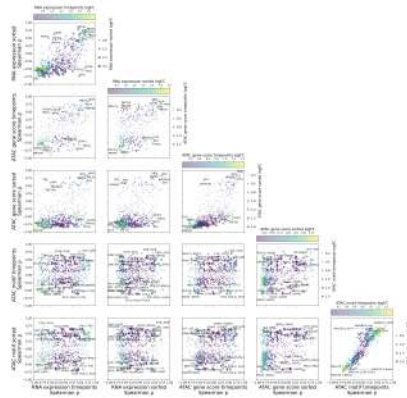


Figure 77: Supplementary: X-plot showing Spearman correlations against pseudotime, for all pairs of assays, with MAGIC smoothing for gene score and RNA expression

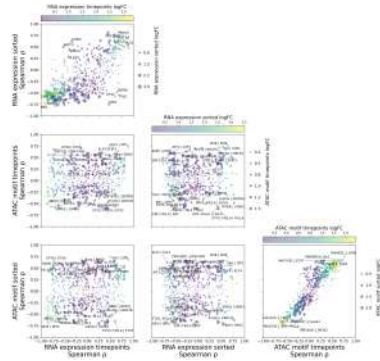


Figure 78: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping sorted and timepoints assays for RNA and gene score, with MAGIC smoothing for gene score and RNA expression

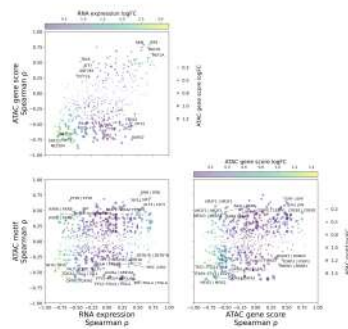


Figure 79: Supplementary: X-plot showing Spearman correlations against pseudotime, grouping all RNA and chromVAR assays with MAGIC smoothing for gene score and RNA expression

## 7 Early populations

### 7.1 Top markers from lineage tracing

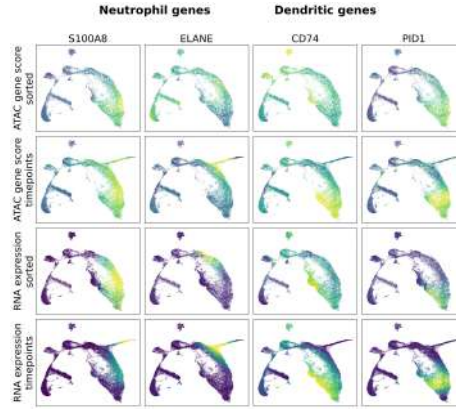


Figure 80: Supplementary: Marker genes previously identified by lineage tracing distinguish early monocyte populations: dendritic-like and neutrophil-like

### 7.2 Early populations classification by backpropagating labels

#### 7.2.1 UMAP

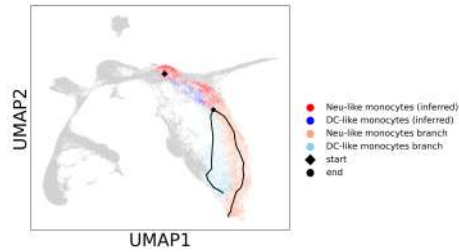


Figure 81: Supplementary: UMAP showing inferred dendritic-like and neutrophil-like early monocyte populations

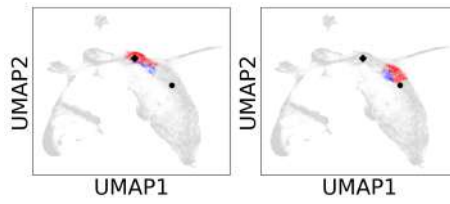


Figure 82: Supplementary: UMAP showing inferred dendritic-like and neutrophil-like early monocyte populations, split into "early" and "late" halves of pseudotime.

### 7.2.2 Volcanos

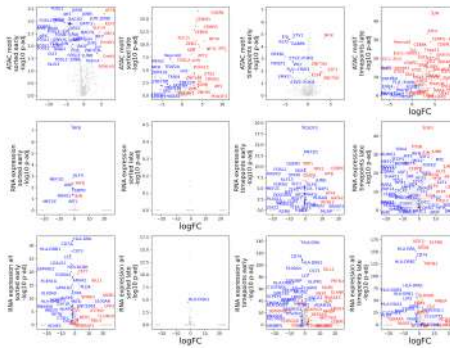


Figure 83: Supplementary: Volcano plots of Wilcoxon test between inferred dendritic-like and neutrophil-like early monocyte populations, for "early" and "late" halves of pseudotime. Motifs and RNA expression show TFs only while RNA expression all shows all genes





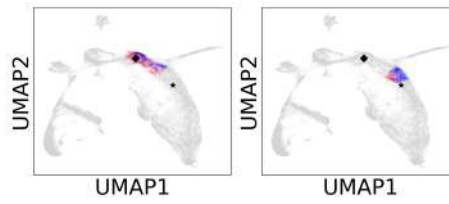


Figure 86: Supplementary: UMAP showing inferred dendritic-like and neutrophil-like early monocyte populations, split into "early" and "late" halves of pseudotime.

### 7.3.2 Volcanos

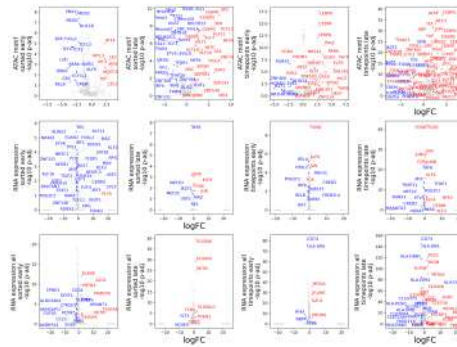


Figure 87: Supplementary: Volcano plots of Wilcoxon test between inferred dendritic-like and neutrophil-like early monocyte populations, for "early" and "late" halves of pseudotime. Motifs and RNA expression show TFs only while RNA expression all shows all genes