# Project 1

# Quantification of tumor-infiltrating lymphocytes from imaging and sequencing data

#### **Data overview**

Tumors are infiltrated by different immune cell types, which can either support or counteract tumor growth. quanTlseq (<a href="https://icbi.i-med.ac.at/quantiseq">https://icbi.i-med.ac.at/quantiseq</a>) is a computational method that quantifies the fraction of different immune cell types from RNA sequencing (RNA-seq) data of blood or tumor samples [1]. It has been used to analyze more than 8,000 patients across 19 cancer types of The Cancer Genome Atlas (TCGA). The results of this analysis for four cancer types are saved in the files:

- TCGA\_SKCM\_quanTlseq.txt (melanoma)
- TCGA BRCA quanTlseq.txt (breast cancer)
- TCGA LUAD quanTlseq.txt (lung adenocarcinoma)
- TCGA\_LUSC\_quanTlseq.txt (lung squamous cell carcinoma).

#### The files are available here:

https://github.com/FFinotello/Rcourse/tree/master/Projects.

In a parallel study [2], tumor-infiltrating lymphocytes (TILs) have been quantified from histological images of TCGA patients. The results of this analysis are available in the Supplementary Material of the original publication, as an Excel file available from the following link: <a href="https://ars.els-cdn.com/content/image/1-s2.0-S2211124718304479-mmc2.xlsx">https://ars.els-cdn.com/content/image/1-s2.0-S2211124718304479-mmc2.xlsx</a>. The file reports various features, including the patients' identifiers ("ParticipantBarcode" column), the cancer types ("Study"), and the percentage of TILs estimated from images ("til percentage").

## Analysis to be performed

For each cancer type, select the patients' identifiers (example format: "TCGA-34-2596") in common between the two datasets.

For each patient, compute the fraction of lymphocytes ("fTIL") estimated by quanTlseq for these patients by summing up the cell fractions of the following cell types:

- B.cells
- NK.cells
- T.cells.CD4
- T.cells.CD8
- Tregs

For each of the four cancer types, compare fTIL (derived from RNA-seq data with quanTIseq) with the til\_percentage (derived from images) using scatterplots and Pearson's correlation.

Discuss the results considering that RNA-seq data and image data for a single patient are usually derived from different tumor portions. Discuss the results also in the light of the results obtained in the original publication using a previous deconvolution method (see Figure 4C in [2]).

### Report

The analysis above should be described in a short report that will be evaluated and considered for the final grade. The report should:

- Contain the code implemented to run the analysis above, together with the results (as tables, plots, or just numbers reported within the text) and their description/discussion.
- Be at maximum 6 pages long.
- Be saved in a Word doc named "Surname\_Name\_Project1.doc".
- Be sent by e-mail to Dr. Finotello not later than June 03, 2019, using "RProject1\_2019" as e-mail object.

#### References

- [1] Finotello F, Mayer C, Plattner C, Laschober G, Rieder D, Hackl H, Krogsdam A, Loncova Z, Posch W, Wilflingseder D, Sopper S, Ijsselsteijn M, Brouwer TP, Johnson D, Xu Y, Wang Y, Sanders ME, Estrada MV, Ericsson-Gonzalez P, Charoentong P, Balko J, de Miranda N, Trajanoski Z. *Molecular and pharmacological modulators of the tumor immune contexture revealed by deconvolution of RNA-seq data*. Genome Medicine (in press).
- [2] Saltz J, Gupta R, Hou L, Kurc T, Singh P, Nguyen V, Samaras D, Shroyer KR, Zhao T, Batiste R, Van Arnam J; Cancer Genome Atlas Research Network, Shmulevich I, Rao AUK, Lazar AJ, Sharma A, Thorsson V. Spatial Organization and Molecular Correlation of Tumor-Infiltrating Lymphocytes Using Deep Learning on Pathology Images. Cell Reports, 23(1), 181–193.e7.