

# ImmuneDeconv

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## R Markdown

```
library(biomaRt)
library(immuneDeconv)
library(corrplot)
library(forcats)
library(stringr)
library(here)
library(dplyr)
library(tidyr)
library(ggplot2)
library(RColorBrewer)
```

```
annotate_genes <- function(df){

  df$hgnc_symbol <- df$gene
  mart <- useMart(biomart = "ensembl", dataset = "hsapiens_gene_ensembl") #, host="uswest.ensembl.org"
  info <- getBM(attributes=c("hgnc_symbol",
                             "ensembl_gene_id_version",
                             "chromosome_name",
                             "start_position",
                             "end_position",
                             "strand",
                             "entrezgene_description"),
                filters = c("hgnc_symbol"),
                values = df$gene,
                mart = mart,
                useCache=FALSE)

  tmp <- merge(df, info, by="hgnc_symbol")
  tmp$strand <- gsub("-1", "-", tmp$strand)
  tmp$strand <- gsub("1", "+", tmp$strand)
  tmp <- tmp[!grepl("CHR", tmp$chromosome_name),]

  return(tmp)

}

convert_ensg_version_to_hgnc_df_rownames <- function(df, ensdb = EnsDb.Hsapiens.v86){
  library(AnnotationDbi)
```

```

library(ensembl)
library(EnsDb.Hsapiens.v86)
genes_base <- str_split_fixed(string = rownames(df), pattern = "\\.", n = 2)[,1]
newnames_original <- suppressWarnings(mapIds(EnsDb.Hsapiens.v86,
  keys = genes_base,
  column = 'SYMBOL',
  keytype = 'GENEID'))

# keep ens version of newnames is na or is duplicated
newnames <- ifelse(is.na(newnames_original) | duplicated(newnames_original),
  rownames(df), newnames_original)
rownames(df) <- newnames
return(df)
}

```

```

salmon_tpm_path <- "/home/rstudio/Documents/PhD/CAF_data/nfcore_results/inhouse_data_nfcore_results_ver
salmon_tpm_in <- read.table(salmon_tpm_path, header = T)
colnames(salmon_tpm_in) <- gsub("X", "", colnames(salmon_tpm_in))
tx2gene_path = "~/Documents/PhD/subtypes/caf-subtype-analysis/nf-subpop/outdir/tx2gene/tx2gene.txt"
tx2gene <- read.table(tx2gene_path, header = T)

```

```
salmon_tpm_in[1:5,1:5]
```

```

##           gene_id gene_name      3532      3533      3536
## 1 ENSG00000000003.14   TSPAN6 15.867374 18.118736 17.147614
## 2 ENSG00000000005.6    TNMD  0.000000  0.000000  0.041895
## 3 ENSG000000000419.12   DPM1 76.108329 73.852506 73.578070
## 4 ENSG000000000457.14   SCYL3  4.126492  4.089532  3.484089
## 5 ENSG000000000460.17 C1orf112 16.378414 12.994835 12.456041

```

```
salmon_tpm_hgnc <- convert_ensg_version_to_hgnc_df_rownames(salmon_tpm_in)
```

```
## Loading required package: stats4
```

```
## Loading required package: BiocGenerics
```

```
##
```

```
## Attaching package: 'BiocGenerics'
```

```
## The following objects are masked from 'package:dplyr':
```

```
##
```

```
##      combine, intersect, setdiff, union
```

```
## The following objects are masked from 'package:stats':
```

```
##
```

```
##      IQR, mad, sd, var, xtabs
```

```
## The following objects are masked from 'package:base':
```

```
##
```

```
##      anyDuplicated, aperm, append, as.data.frame, basename, cbind,
```

```

##      colnames, dirname, do.call, duplicated, eval, evalq, Filter, Find,
##      get, grep, grepl, intersect, is.unsorted, lapply, Map, mapply,
##      match, mget, order, paste, pmax, pmax.int, pmin, pmin.int,
##      Position, rank, rbind, Reduce, rownames, sapply, setdiff, sort,
##      table, tapply, union, unique, unsplit, which.max, which.min

## Loading required package: Biobase

## Welcome to Bioconductor
##
##      Vignettes contain introductory material; view with
##      'browseVignettes()'. To cite Bioconductor, see
##      'citation("Biobase)"', and for packages 'citation("pkgname)"'.

## Loading required package: IRanges

## Loading required package: S4Vectors

##
## Attaching package: 'S4Vectors'

## The following object is masked from 'package:tidyr':
##
##      expand

## The following objects are masked from 'package:dplyr':
##
##      first, rename

## The following object is masked from 'package:utils':
##
##      findMatches

## The following objects are masked from 'package:base':
##
##      expand.grid, I, unname

##
## Attaching package: 'IRanges'

## The following objects are masked from 'package:dplyr':
##
##      collapse, desc, slice

##
## Attaching package: 'AnnotationDbi'

## The following object is masked from 'package:dplyr':
##
##      select

```

```

## Loading required package: GenomicRanges

## Loading required package: GenomeInfoDb

## Loading required package: GenomicFeatures

## Loading required package: AnnotationFilter

##
## Attaching package: 'ensembldb'

## The following object is masked from 'package:dplyr':
##
##      filter

## The following object is masked from 'package:stats':
##
##      filter

salmon_tpm_hgnc_not_duplicated <- salmon_tpm_hgnc[!duplicated(salmon_tpm_hgnc$gene_name),]
salmon_tpm_hgnc_not_duplicated_hgnc_col <- subset(salmon_tpm_hgnc_not_duplicated, select = -c(gene_id))
colnames(salmon_tpm_hgnc_not_duplicated_hgnc_col) <- gsub("X", "Sample_", colnames(salmon_tpm_hgnc_not_duplicated_hgnc_col))
#write.table(salmon_tpm_hgnc_not_duplicated_hgnc_col, file = "/home/rstudio/Downloads/salmon_tpm_hgnc_not_duplicated_hgnc_col.csv", as.is = TRUE)
rownames(salmon_tpm_hgnc_not_duplicated) <- salmon_tpm_hgnc_not_duplicated$gene_name
salmon_tpm_hgnc_not_duplicated <- subset(salmon_tpm_hgnc_not_duplicated, select = -c(gene_name, gene_id))

metadata <- read.csv(file = here("~/Documents/PhD/subtypes/caf-subtype-analysis/intermediate_files/metadata.csv"), as.is = TRUE)

colnames(metadata)[1] <- "sample"
metadata$sample <- as.character(metadata$sample)
metadata$Condition <- ifelse(metadata$Condition == "Tumour", "CAF", "TAN")

metadata

##      sample Patient Condition Age Size  Grade Histology      ER      PR
## 1      4033      1      CAF  46  45 Grade_2  Lobular ER_positive PR_positive
## 2      4034      1      TAN  46  45 Grade_2  Lobular ER_positive PR_positive
## 3      4027      2      CAF  77  40 Grade_3   Ductal ER_negative PR_negative
## 4      4028      2      TAN  77  40 Grade_3   Ductal ER_negative PR_negative
## 5      4112      3      CAF  62  12 Grade_3   Ductal ER_positive PR_negative
## 6      4113      3      TAN  62   8 Grade_3   Ductal ER_positive PR_negative
## 7      4116      4      CAF  45  35 Grade_2  Lobular ER_positive PR_positive
## 8      4117      4      TAN  45  13 Grade_2  Lobular ER_positive PR_positive
## 9      4214      5      CAF  78  90 Grade_2  Lobular ER_positive PR_negative
## 10     4215      5      TAN  78  90 Grade_2  Lobular ER_positive PR_negative
## 11     4315      6      CAF  84  30 Grade_2   Ductal ER_positive PR_positive
## 12     4316      6      TAN  84  22 Grade_2   Ductal ER_positive PR_positive
## 13     4340      7      CAF  62 100 Grade_2  Lobular ER_positive PR_positive
## 14     4341      7      TAN  62 100 Grade_2  Lobular ER_positive PR_positive
## 15     4344      8      CAF  50  28 Grade_2   Ductal ER_positive PR_positive
## 16     4345      8      TAN  50  28 Grade_2   Ductal ER_positive PR_positive

```

```
## 17 3532 9 CAF 48 16 Grade_2 Ductal ER_positive PR_positive
## 18 3533 9 TAN 48 16 Grade_2 Ductal ER_positive PR_positive
## 19 3536 10 CAF 50 52 Grade_3 Lobular ER_positive PR_positive
## 20 3537 10 TAN 50 52 Grade_3 Lobular ER_positive PR_positive
## 21 4299 11 CAF 84 40 Grade_3 Ductal ER_positive PR_positive
## 22 4300 11 TAN 84 40 Grade_3 Ductal ER_positive PR_positive
## 23 4722 12 CAF 81 52 Grade_2 Lobular ER_positive PR_negative
## 24 4723 12 TAN 81 52 Grade_2 Lobular ER_positive PR_negative
##           Her2 Subtype LVI
## 1 Her2_negative LuminalA LVI_negative
## 2 Her2_negative LuminalA LVI_negative
## 3 Her2_negative TNBC LVI_positive
## 4 Her2_negative TNBC LVI_positive
## 5 Her2_negative LuminalA LVI_negative
## 6 Her2_negative LuminalA LVI_negative
## 7 Her2_negative LuminalA LVI_positive
## 8 Her2_negative LuminalA LVI_positive
## 9 Her2_negative LuminalA LVI_positive
## 10 Her2_negative LuminalA LVI_positive
## 11 Her2_negative LuminalA LVI_positive
## 12 Her2_negative LuminalA LVI_positive
## 13 Her2_negative LuminalA LVI_negative
## 14 Her2_negative LuminalA LVI_negative
## 15 Her2_negative LuminalA LVI_negative
## 16 Her2_negative LuminalA LVI_negative
## 17 Her2_negative LuminalA LVI_negative
## 18 Her2_negative LuminalA LVI_negative
## 19 Her2_negative LuminalA LVI_negative
## 20 Her2_negative LuminalA LVI_negative
## 21 Her2_negative LuminalA LVI_positive
## 22 Her2_negative LuminalA LVI_positive
## 23 Her2_negative LuminalA LVI_negative
## 24 Her2_negative LuminalA LVI_negative
```

```
# includes cancer-associated fibroblast
deconvolution_mcp <- immunedeconv::deconvolute(salmon_tpm_hgnc_not_duplicated, "mcp_counter")
```

```
##
## >>> Running mcp_counter
```

```
deconvolution_mcp_filtered_long <- deconvolution_mcp %>% dplyr::filter(cell_type %in% c("Cancer associated fibroblast", "Tumor-infiltrating lymphocyte"))
deconvolution_mcp_filtered_long_metadata <- full_join(deconvolution_mcp_filtered_long, metadata)
```

```
## Joining with 'by = join_by(sample)'
```

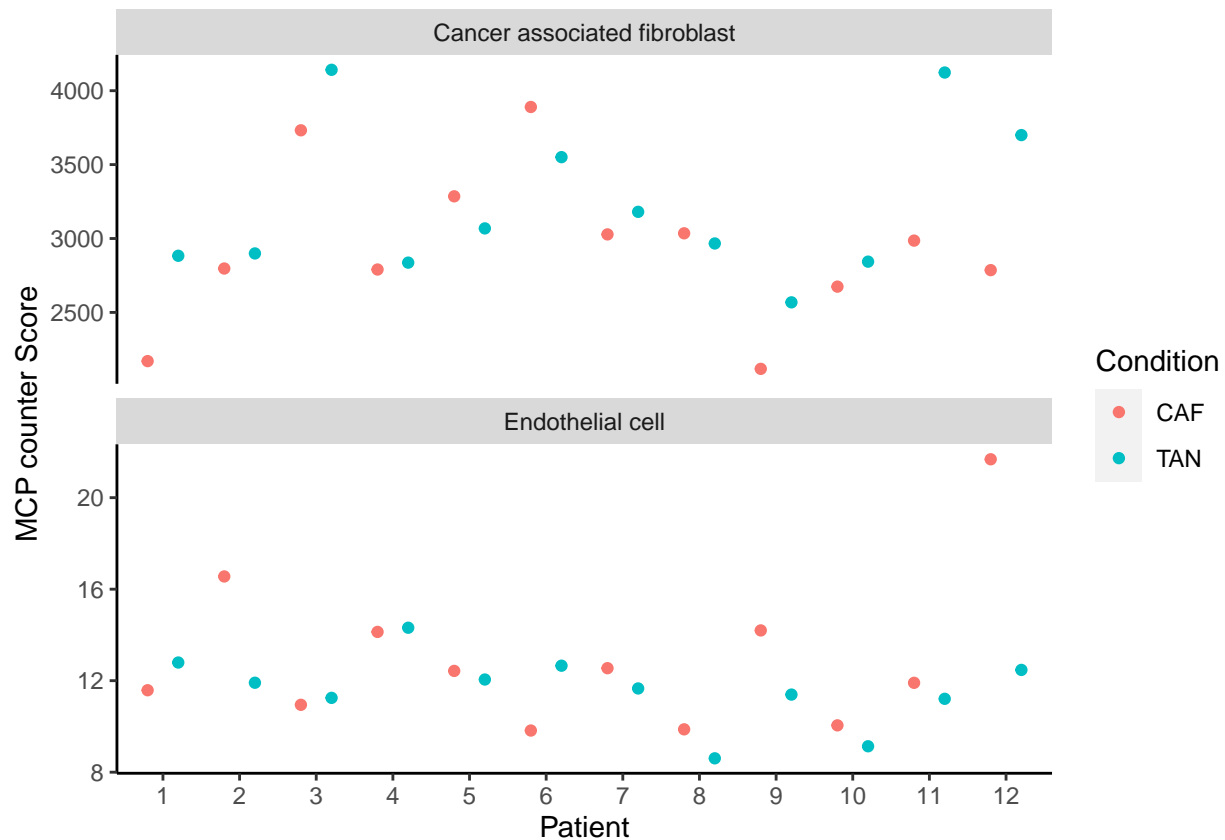
```
ord <- as.character(seq(1,12,1))
# Plotting
deconvolution_mcp_filtered_long_metadata_ordered <- deconvolution_mcp_filtered_long_metadata[order(deconvolution_mcp_filtered_long_metadata$sample),]
mcp_plot <- ggplot(deconvolution_mcp_filtered_long_metadata_ordered, aes(x = as.character(Patient), y = as.character(Feature))) +
  geom_point(position = position_dodge(width = 0.8)) +
  scale_x_discrete(limits = ord) +
  theme(#panel.grid.major = element_blank(),
```

```

#panel.grid.minor = element_blank(),
panel.background = element_blank(),
axis.line = element_line(colour = "black")) +
facet_wrap(~ cell_type, nrow = 2, scales = "free_y") +
xlab("Patient") +
ylab("MCP counter Score")

```

mcp\_plot



```

# no fibroblast cell type
quantiseq <- immunedeconv::deconvolute(salmon_tpm_hgnc_not_duplicated, method= "quantiseq")

```

```

##
## >>> Running quantiseq

##
## Running quanTIseq deconvolution module

## Gene expression normalization and re-annotation (arrays: FALSE)

## Removing 17 noisy genes

## Removing 15 genes with high expression in tumors

```

```

## Signature genes found in data set: 135/138 (97.83%)

## Mixture deconvolution (method: lsei)

## Deconvolution successful!

set_cibersort_binary("/home/rstudio/sw/CIBERSORT/CIBERSORT.R")
#set_cibersort_binary("/home/rstudio/sw/CIBERSORT/CIBERSORT_1.4.R")
set_cibersort_mat("/home/rstudio/sw/CIBERSORT/LM22.txt")
#cibersort_out <- immunedeconv::deconvolute(salmon_tpm_hgnc_not_duplicated, "cibersort") # or 'cibersort'

# includes cancer-associated fibroblast
deconvolution_epic <- immunedeconv::deconvolute(salmon_tpm_hgnc_not_duplicated, "epic")

##
## >>> Running epic

## Warning in (function (bulk, reference = NULL, mRNA_cell = NULL, mRNA_cell_sub = NULL, : The optimization
## 4723
## - check fit.gof for the convergeCode and convergeMessage

## Warning in (function (bulk, reference = NULL, mRNA_cell = NULL, mRNA_cell_sub =
## NULL, : mRNA_cell value unknown for some cell types: CAFs, Endothelial - using
## the default value of 0.4 for these but this might bias the true cell
## proportions from all cell types.

#cibersort_signature_matrix <- read.table("/home/rstudio/Documents/PhD/")

deconvolution_timer <- deconvolute(salmon_tpm_hgnc_not_duplicated, "timer",
                                indications=rep("BRCA", 24))

##
## >>> Running timer

## ## Enter batch mode

## ## Loading immune gene expression

## [1] "Outlier genes: ACTB ACTG1 COL1A1 COL1A2 EEF1A1 FN1 GAPDH MT-ATP8 MT-CO1 MT2A SPARC TGFBI TIMP1"

## ## Removing the batch effect of /tmp/RtmpaoXgxF/fileeba5249320a

## Found 1033 genes with uniform expression within a single batch (all zeros); these will not be adjusted

## Found 2 batches

## Adjusting for 0 covariate(s) or covariate level(s)

## Standardizing Data across genes

```

```
## Fitting L/S model and finding priors
```

```
## Finding parametric adjustments
```

```
## Adjusting the Data
```

```
# timer default is for immune cells - no cafs  
deconvolution_timer
```

```
## # A tibble: 6 x 25  
##   cell_type      '3532' '3533' '3536' '3537' '4027' '4028' '4033' '4034' '4112'  
##   <chr>          <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>  
## 1 B cell        0.151 0.139 0.146 0.141 0.151 0.141 0.144 0.132 0.144  
## 2 T cell CD4+   0.167 0.162 0.161 0.163 0.163 0.164 0.164 0.165 0.159  
## 3 T cell CD8+   0.162 0.149 0.146 0.147 0.150 0.157 0.146 0.159 0.148  
## 4 Neutrophil    0.115 0.127 0.134 0.124 0.120 0.120 0.126 0.119 0.116  
## 5 Macrophage    0.113 0.115 0.112 0.124 0.108 0.115 0.129 0.131 0.133  
## 6 Myeloid dendri~ 0.356 0.331 0.329 0.328 0.365 0.333 0.325 0.318 0.323  
## # i 15 more variables: '4113' <dbl>, '4116' <dbl>, '4117' <dbl>, '4214' <dbl>,  
## #   '4215' <dbl>, '4299' <dbl>, '4300' <dbl>, '4315' <dbl>, '4316' <dbl>,  
## #   '4340' <dbl>, '4341' <dbl>, '4344' <dbl>, '4345' <dbl>, '4722' <dbl>,  
## #   '4723' <dbl>
```

```
deconvolution_xcell <- immunedeconv::deconvolute(salmon_tpm_hgnc_not_duplicated, "xcell")
```

```
##
```

```
## >>> Running xcell
```

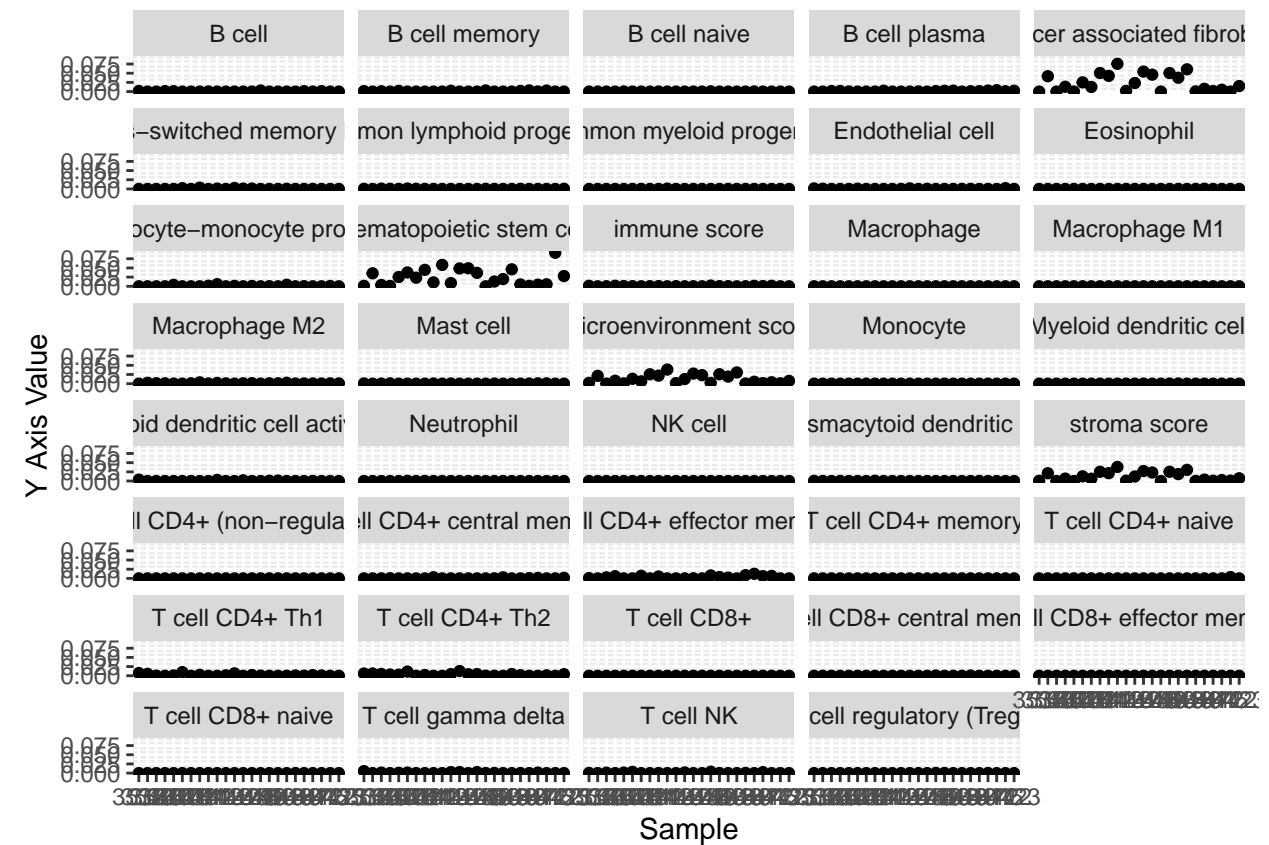
```
colnames(deconvolution_xcell) <- gsub("X", "", colnames(deconvolution_xcell))
```

```
# cancer-associated fibroblast, hematopoietic stem cell, microenvironment score, stroma score  
deconvolution_xcell_long <- deconvolution_xcell %>% pivot_longer(!cell_type, names_to = "sample", values_to = "score")
```

```
# ggplot(data = deconvolution_xcell, aes(x = cell_type, y = xcell_score)) +  
#   geom_bar(stat = "identity", alpha = 0.7) +  
#   facet_grid(. ~sample) +  
#   ylim(0,800) +  
#   geom_text(aes(label = Freq), fontface = "bold", vjust = 1.5, colour = "white", size = 4) +  
#   labs(x = "\n Coin Flip Outcome", y = "Frequency\n", title = "\n Coin Flip Results \n") +  
#   theme(plot.title = element_text(hjust = 0.5),  
#         axis.title.x = element_text(face="bold", colour="darkgreen", size = 12),  
#         axis.title.y = element_text(face="bold", colour="darkgreen", size = 12),  
#         legend.title = element_text(face="bold", size = 10),  
#         strip.background = element_rect(fill="lightblue", colour="black", size=1),  
#         strip.text = element_text(face="bold", size=rel(1.2)))  
# Create the ggplot object  
ggplot(deconvolution_xcell_long, aes(x = sample, y = xcell_score)) +  
# Add the facet wrap  
facet_wrap(~ cell_type, ncol = 5) +  
# Add the points  
geom_point() +
```



```
# Add the x-axis label
xlab("Sample") +
# Add the y-axis label
ylab("Y Axis Value")
```

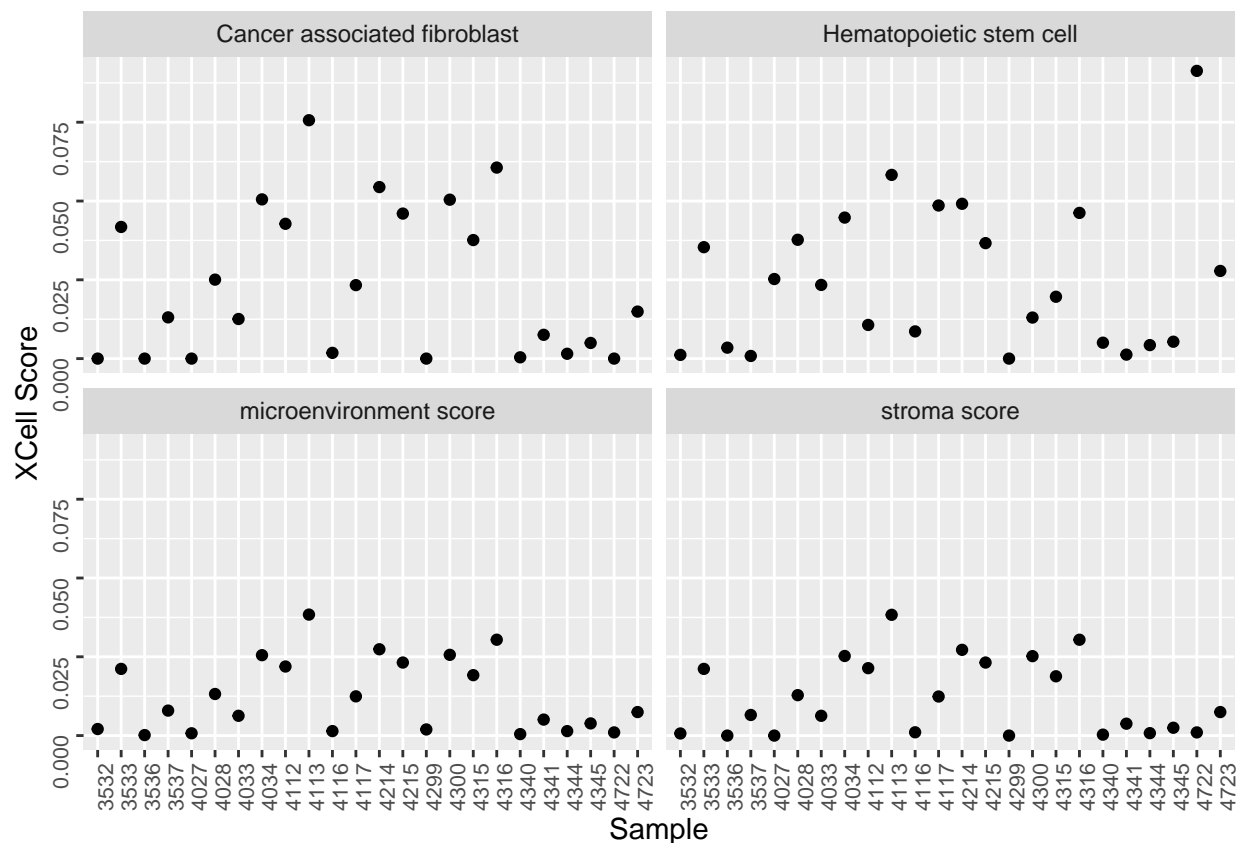


```
deconvolution_xcell_filtered_long <- deconvolution_xcell %>% dplyr::filter(cell_type %in% c("Cancer associated fibroblast", "endothelial cell", "macrophage", "T cell", "B cell", "natural killer cell", "dendritic cell", "myeloid cell", "stromal cell", "epithelial cell", "neuron", "astrocyte", "microglia", "pericyte", "endothelial cell", "macrophage", "T cell", "B cell", "natural killer cell", "dendritic cell", "myeloid cell", "stromal cell", "epithelial cell", "neuron", "astrocyte", "microglia", "pericyte"))
deconvolution_xcell_filtered_long_metadata <- full_join(deconvolution_xcell_filtered_long, metadata)
```

```
## Joining with 'by = join_by(sample)'
```

```
#deconvolution xcell %>% pivot_longer(!cell_type, names_to = "sample", values_to = "xcell_score")
```

```
ggplot(deconvolution_xcell_filtered_long, aes(x = sample, y = xcell_score)) +  
  # Add the facet wrap  
  facet_wrap(~ cell_type, ncol = 2) +  
  # Add the points  
  geom_point() +  
  # Add the x-axis label  
  xlab("Sample") +  
  # Add the y-axis label  
  ylab("XCell Score") +  
  theme(axis.text = element_text(size = 8, angle = 90))
```



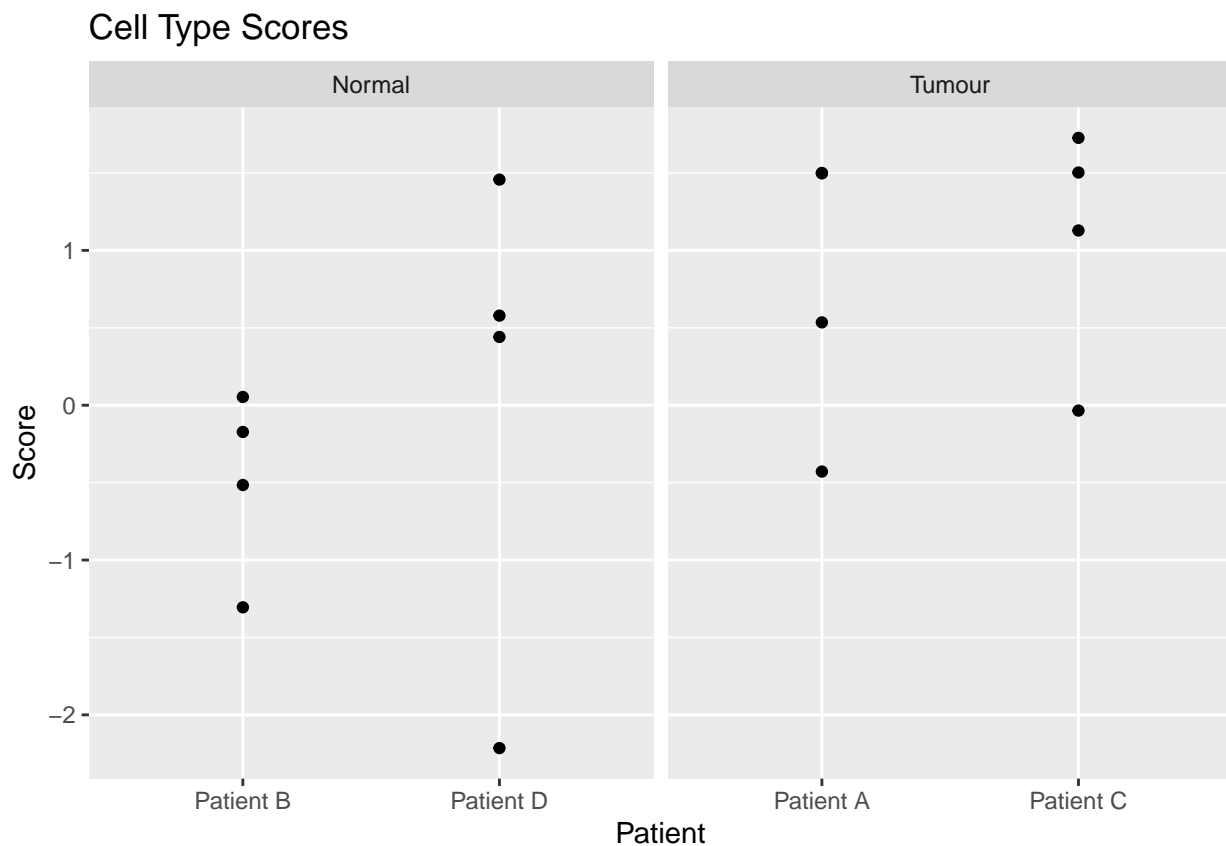
```
xcell_plot <- deconvolution_xcell_filtered_long_metadata %>%
  mutate(Condition = fct_relevel(Condition, "TAN", "CAF")) %>%
  ggplot(aes(x = Patient, y = xcell_score)) +
  #geom_col() +
  facet_wrap(~Patient, nrow=1, scales = "free_x", strip.position = "bottom") +
  facet_wrap(~ cell_type, ncol = 2) +
  #theme(plot.title = element_text(hjust = 0.5, size = 14, face = "bold"),
  #axis.text.y = element_text(size = 12, face = "bold"),
  #axis.text.x = element_text(size = 8),
  #strip.text.y = element_text(size = rel(100))
  #) +
  #ggtitle("CAF subpopulation proportions\n determined by CIBERSORTx") +
  scale_fill_manual(name=NULL,
    values = c(brewer.pal(3, "Dark2"), "gray")
  ) +
  xlab(label = "Patient") +
  ylab("XCell score") +
  theme(#panel.grid.major = element_blank(),
    #panel.grid.minor = element_blank(),
    panel.background = element_blank(),
    axis.line = element_line(colour = "black")) +
    # scale_y_continuous(expand = c(0,0)) +
    #geom_hline(yintercept = c(25, 50, 75), color = "gray", linetype = "dashed") +
  theme(legend.text=element_text(size=rel(1.2)),
    axis.text.x = element_text(size = 8, angle = 90))
```

```

# Example data frame
df <- data.frame(
  Patient = rep(c("Patient A", "Patient B", "Patient C", "Patient D"), 4),
  CellType = rep(c("Cell Type 1", "Cell Type 2", "Cell Type 3", "Cell Type 4"), each = 4),
  Status = rep(c("Tumour", "Normal"), times = 8),
  Score = rnorm(16)
)

# Plotting
ggplot(df, aes(x = Patient, y = Score)) +
  geom_point() +
  facet_wrap(~ CellType, scales = "free_y") +
  facet_grid(~ Status, scales = "free_x") +
  xlab("Patient") +
  ylab("Score") +
  ggtitle("Cell Type Scores")

```



```

xcell_plot_test <- deconvolution_xcell_filtered_long_metadata %>%
  dplyr::filter(cell_type == "Cancer associated fibroblast") %>%
  mutate(Condition = fct_relevel(Condition, "TAN", "CAF")) %>%
  ggplot(aes(x = Condition, y = xcell_score)) +
  geom_point() +
  facet_wrap(~Patient, nrow=1, scales = "free_x", strip.position = "bottom") +
  theme(plot.title = element_text(hjust = 0.5, size = 14, face = "bold"),
        axis.text.y = element_text(size = 12, face = "bold"),

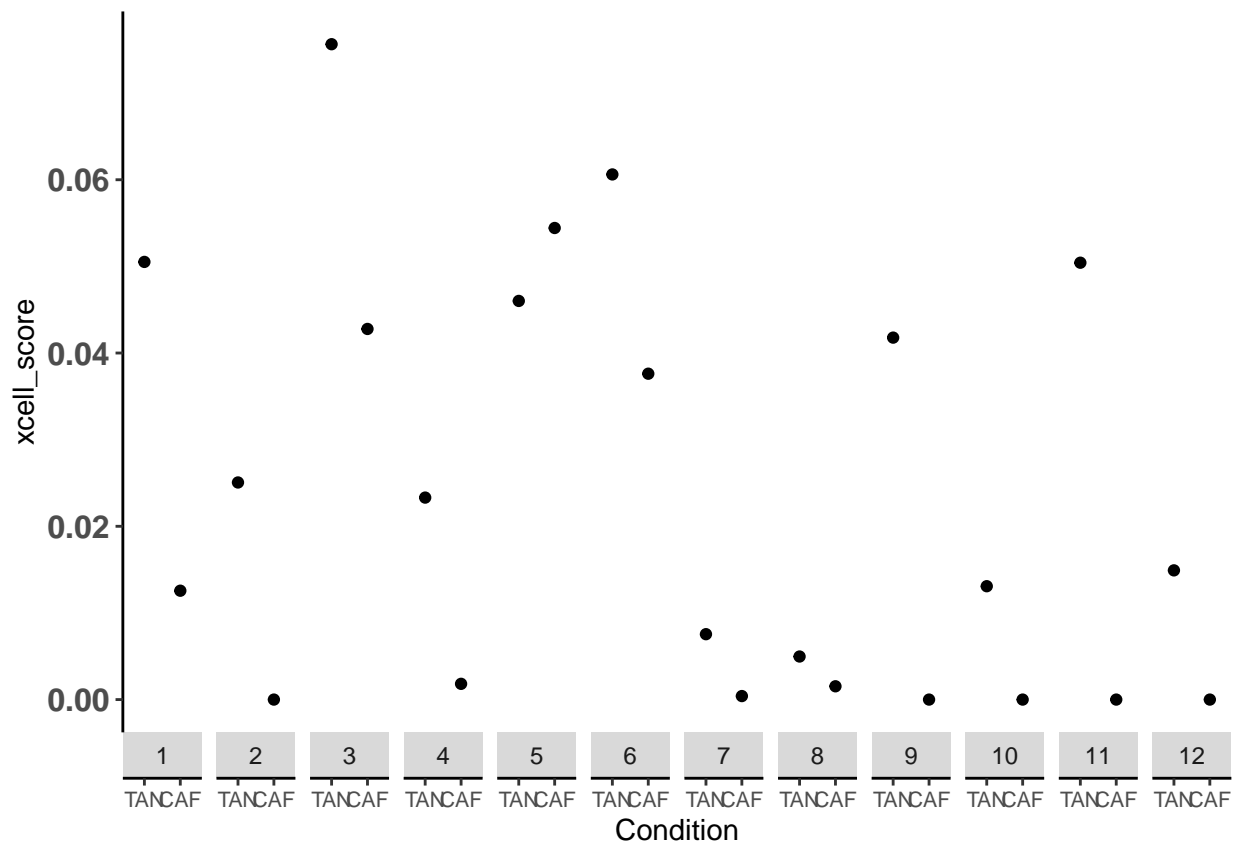
```

```

    axis.text.x = element_text(size = 8),
    strip.text.y = element_text(size = rel(100))
  ) +
  #ggtitle("CAF subpopulation proportions\n determined by CIBERSORTx") +
  #  scale_fill_manual(name=NULL,
  #                    values = c(brewer.pal(3, "Dark2"), "gray")
  #                    ) +
  #xlab(label = "Patient") +
  theme(#panel.grid.major = element_blank(),
        #panel.grid.minor = element_blank(),
        panel.background = element_blank(),
        axis.line = element_line(colour = "black")) +
  #  scale_y_continuous(expand = c(0,0.08)) +
  #geom_hline(yintercept = c(25, 50, 75), color = "gray", linetype = "dashed") +
  theme(legend.text=element_text(size=rel(1.2)),
        axis.text.x = element_text(size = 8))

```

xcell\_plot\_test



```

xcell_plot_test2 <- deconvolution_xcell_filtered_long_metadata %>%
  #dplyr::filter(cell_type == "Cancer associated fibroblast") %>%
  mutate(Condition = fct_relevel(Condition, "TAN", "CAF")) %>%
  ggplot(aes(x = Condition, y = xcell_score)) +
  geom_point() +
  facet_wrap(~Patient, nrow=1, scales = "free_x", strip.position = "bottom") +

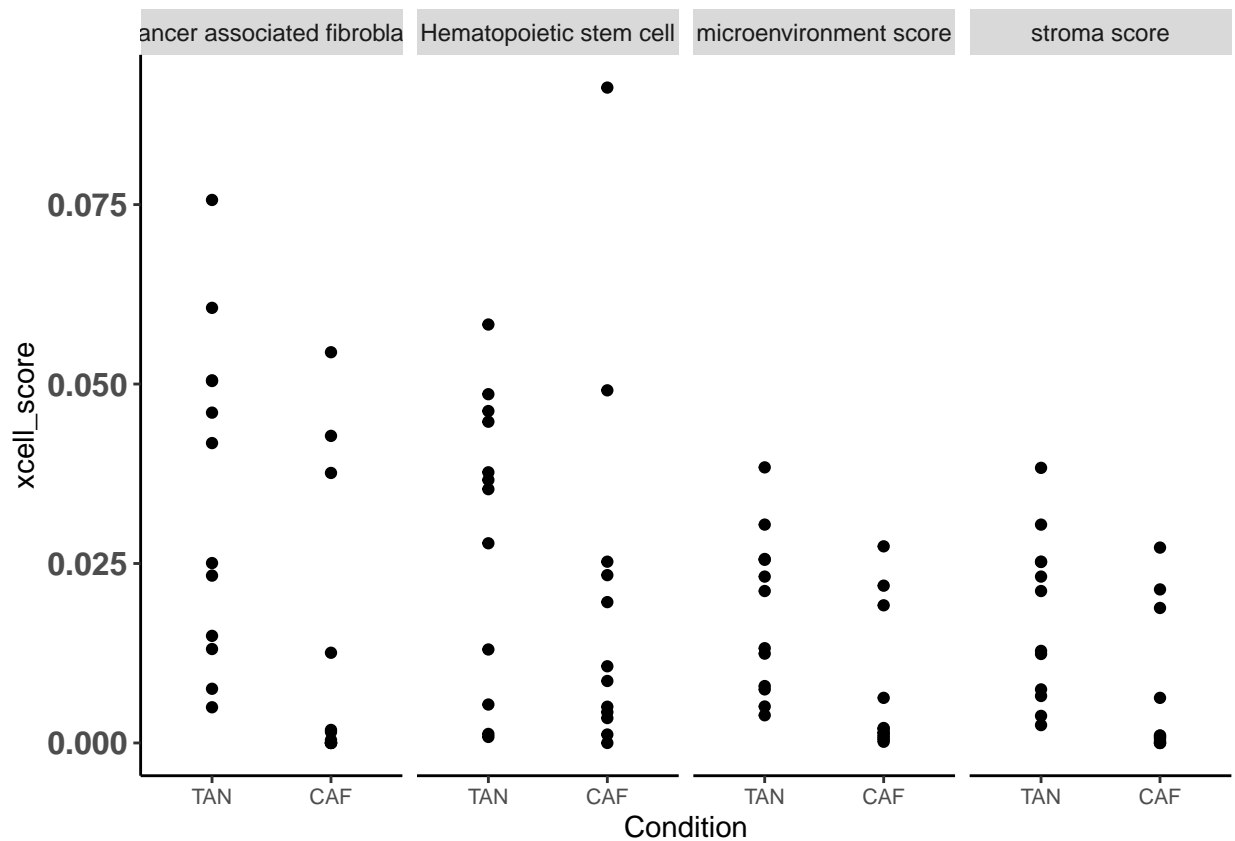
```

```

theme(plot.title = element_text(hjust = 0.5, size = 14, face = "bold"),
      axis.text.y = element_text(size = 12, face = "bold"),
      axis.text.x = element_text(size = 8),
      strip.text.y = element_text(size = rel(100))
    ) +
  facet_grid(~ cell_type, scales = "free_y") +
  #ggtitle("CAF subpopulation proportions\n determined by CIBERSORTx") +
  #  scale_fill_manual(name=NULL,
  #                    values = c(brewer.pal(3, "Dark2"), "gray")
  #                    ) +
  #xlab(label = "Patient") +
  theme(#panel.grid.major = element_blank(),
        #panel.grid.minor = element_blank(),
        panel.background = element_blank(),
        axis.line = element_line(colour = "black")) +
  # scale_y_continuous(expand = c(0,0.08)) +
  #geom_hline(yintercept = c(25, 50, 75), color = "gray", linetype = "dashed") +
  theme(legend.text=element_text(size=rel(1.2)),
        axis.text.x = element_text(size = 8))

```

xcell\_plot\_test2



```

# Example data frame
ord <- as.character(seq(1,12,1))

```

```

# Plotting
deconvolution_xcell_filtered_long_metadata_ordered <- deconvolution_xcell_filtered_long_metadata[order(
xcell_plot <- ggplot(deconvolution_xcell_filtered_long_metadata_ordered, aes(x = as.character(Patient),
  geom_point(position = position_dodge(width = 0.8)) +
    scale_x_discrete(limits = ord) +
    theme(#panel.grid.major = element_blank(),
          #panel.grid.minor = element_blank(),
          panel.background = element_blank(),
          axis.line = element_line(colour = "black")) +
  facet_wrap(~ cell_type, nrow = 2, scales = "free_y") +
  xlab("Patient") +
  ylab("xCell Score")

```

```

colnames(deconvolution_epic) <- gsub("X", "", colnames(deconvolution_epic))
deconvolution_epic_long <- deconvolution_epic %>% pivot_longer(!cell_type, names_to = "sample", values_to = "score")

deconvolution_epic_filtered_long <- deconvolution_epic %>% dplyr::filter(cell_type %in% c("Cancer assoc", "Non-Cancer assoc"))
deconvolution_epic_filtered_long_metadata <- full_join(deconvolution_epic_filtered_long, metadata)

```

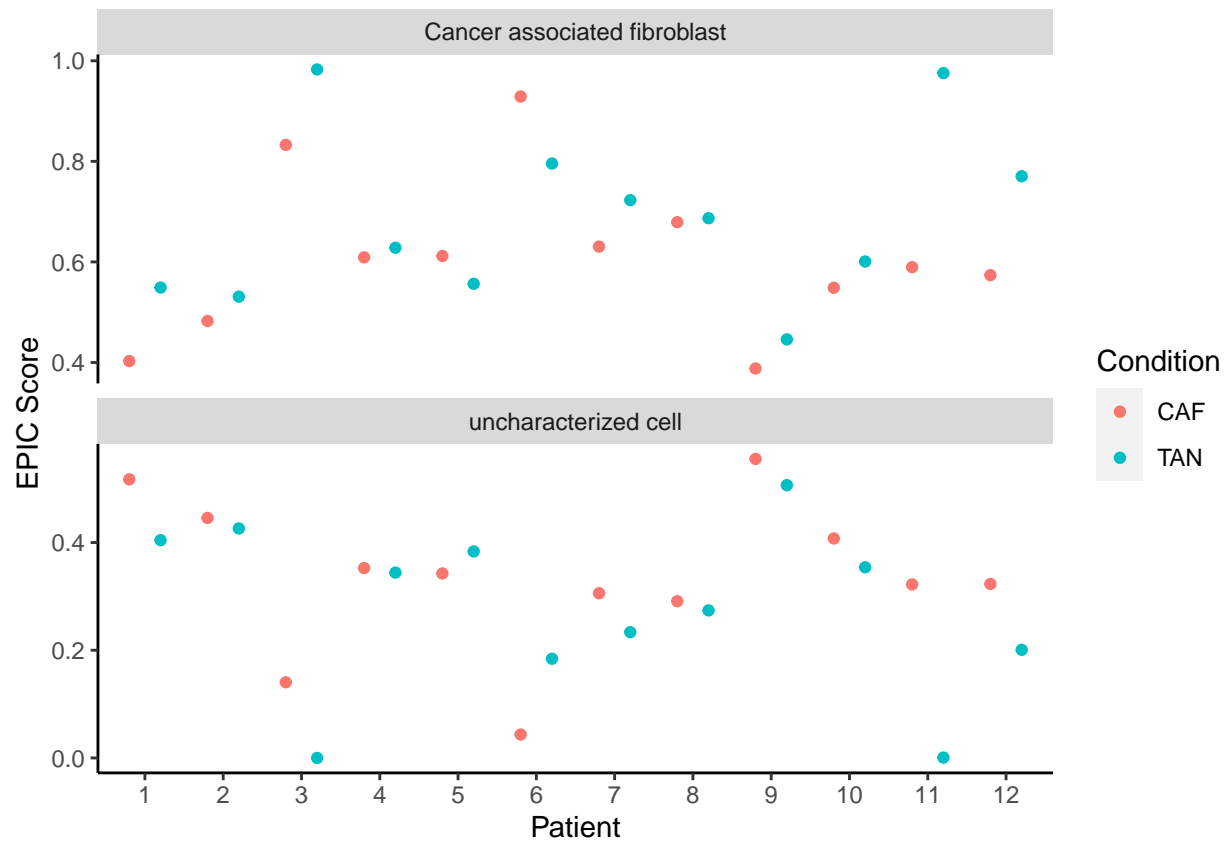
```
## Joining with 'by = join_by(sample)'
```

```

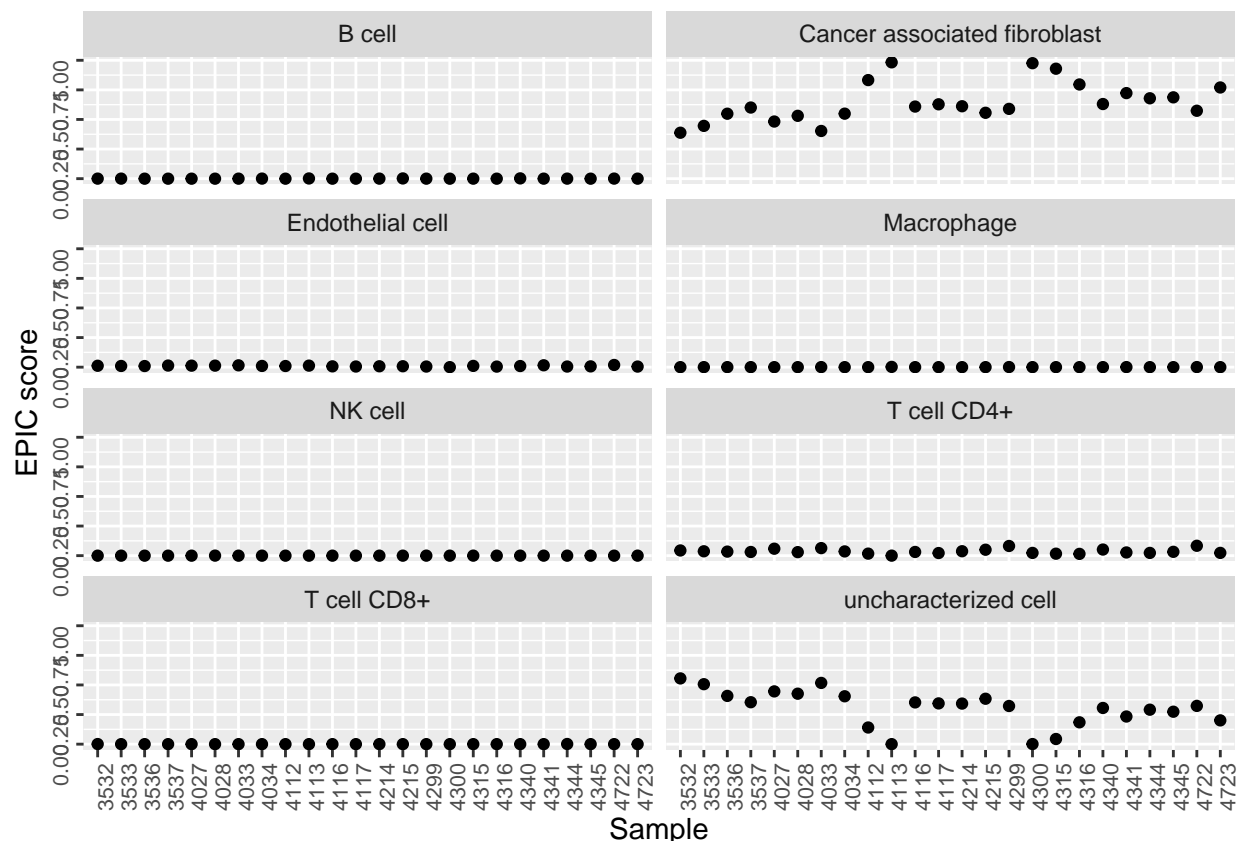
# Plotting
deconvolution_epic_filtered_long_metadata_ordered <- deconvolution_epic_filtered_long_metadata[order(de
epic_plot <- ggplot(deconvolution_epic_filtered_long_metadata_ordered, aes(x = as.character(Patient), y
  geom_point(position = position_dodge(width = 0.8)) +
    scale_x_discrete(limits = ord) +
    theme(#panel.grid.major = element_blank(),
          #panel.grid.minor = element_blank(),
          panel.background = element_blank(),
          axis.line = element_line(colour = "black")) +
  facet_wrap(~ cell_type, nrow = 2, scales = "free_y") +
  xlab("Patient") +
  ylab("EPIC Score")

```

```
epic_plot
```



```
ggplot(deconvolution_epic_long, aes(x = sample, y = epic_score)) +
  # Add the facet wrap
  facet_wrap(~ cell_type, ncol = 2) +
  # Add the points
  geom_point() +
  # Add the x-axis label
  xlab("Sample") +
  # Add the y-axis label
  ylab("EPIC score") +
  theme(axis.text = element_text(size = 8, angle = 90))
```



```
deconvolution_epic_long_metadata <- full_join(deconvolution_epic_long, metadata)
```

```
## Joining with 'by = join_by(sample)'
```

```
#deconvolution_epic_filtered_long_metadata$cell_type <- relevel(deconvolution_epic_filtered_long_metada
```

```
epic_plot_stack <- deconvolution_epic_long_metadata %>%
  mutate(Condition = fct_relevel(Condition, "TAN", "CAF")) %>%
  mutate(epic_score = 100*epic_score) %>%
  ggplot(aes(x = Condition, y = epic_score, fill = cell_type)) +
  geom_col() +
  facet_wrap(~Patient, nrow=1, scales = "free_x", strip.position = "bottom") +
  #theme(plot.title = element_text(hjust = 0.5, size = 14, face = "bold"),
  #axis.text.y = element_text(size = 12, face = "bold"),
  #axis.text.x = element_text(size = 8),
  #strip.text.y = element_text(size = rel(100))
  #) +
  #ggtitle("CAF subpopulation proportions\n determined by CIBERSORTx") +
  scale_fill_manual(name=NULL,
    values = c(brewer.pal(8, "Dark2"))
  ) +
  xlab(label = "Patient") +
  ylab("EPIC cell-type composition (%)") +
  theme(#panel.grid.major = element_blank(),
    #panel.grid.minor = element_blank(),
```



```

    panel.background = element_blank(),
    axis.line = element_line(colour = "black")) +
    scale_y_continuous(expand = c(0,0)) +
    geom_hline(yintercept = c(25, 50, 75), color = "gray", linetype = "dashed") +
    theme(legend.text=element_text(size=rel(1.2)),
          axis.text.x = element_text(size = 8))

# labs(tag = "TAN = Tumour-associated normal\nCAF=Cancer-associated fibroblast") +
#   theme(plot.tag.position = c(0.9, 0.3),)

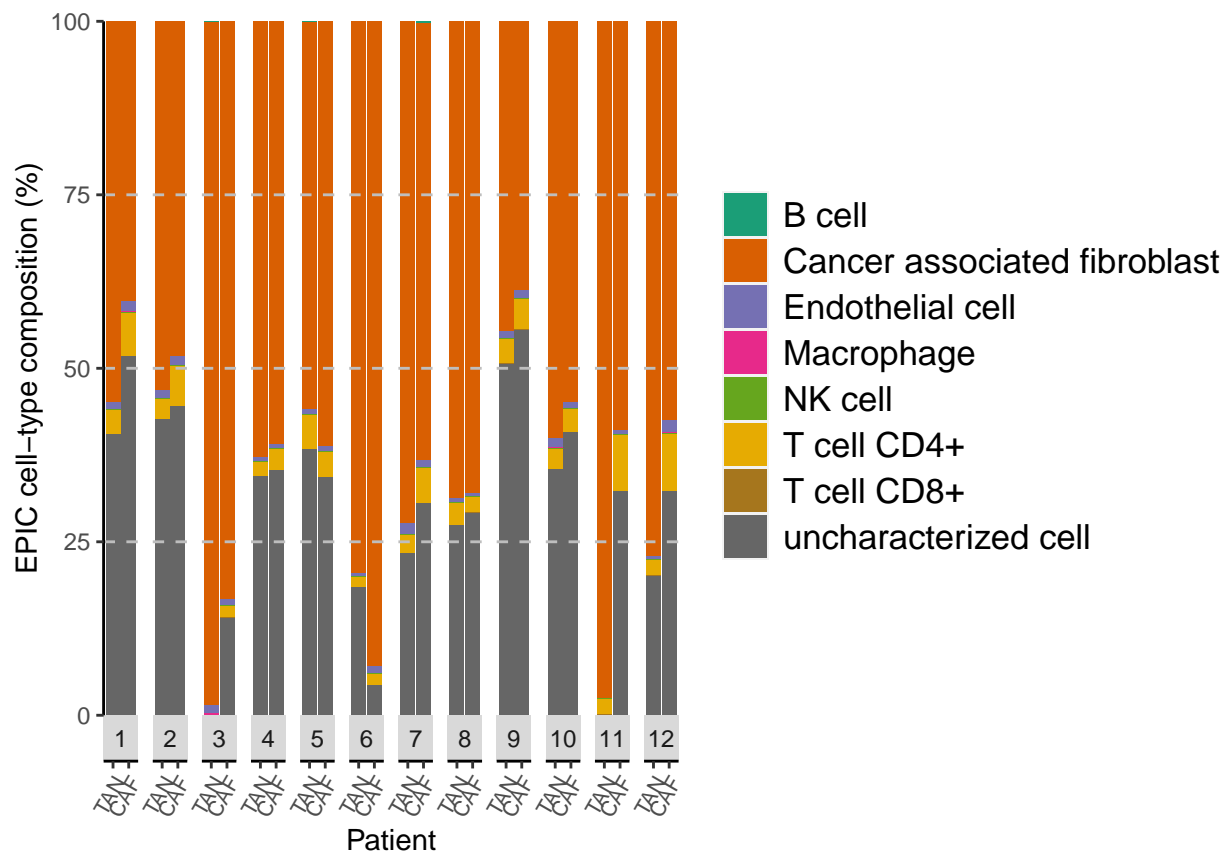
#+
# scale_y_continuous(expand = c(0, 0), limits = c(0, 1.0000001))

```

```

epic_plot_stack <- epic_plot_stack + theme(axis.text.x=element_text(angle=60, hjust=1))
epic_plot_stack

```



```

cor.test(as.numeric(deconvolution_epic[which(deconvolution_epic$cell_type == "Cancer associated fibroblast")],
as.numeric(deconvolution_epic[which(deconvolution_epic$cell_type == "uncharacterized cell")])

##
## Pearson's product-moment correlation
##
## data: as.numeric(deconvolution_epic[which(deconvolution_epic$cell_type == "Cancer associated fibroblast")],
## as.numeric(deconvolution_epic[which(deconvolution_epic$cell_type == "uncharacterized cell")])
## t = -42.528, df = 22, p-value < 2.2e-16

```

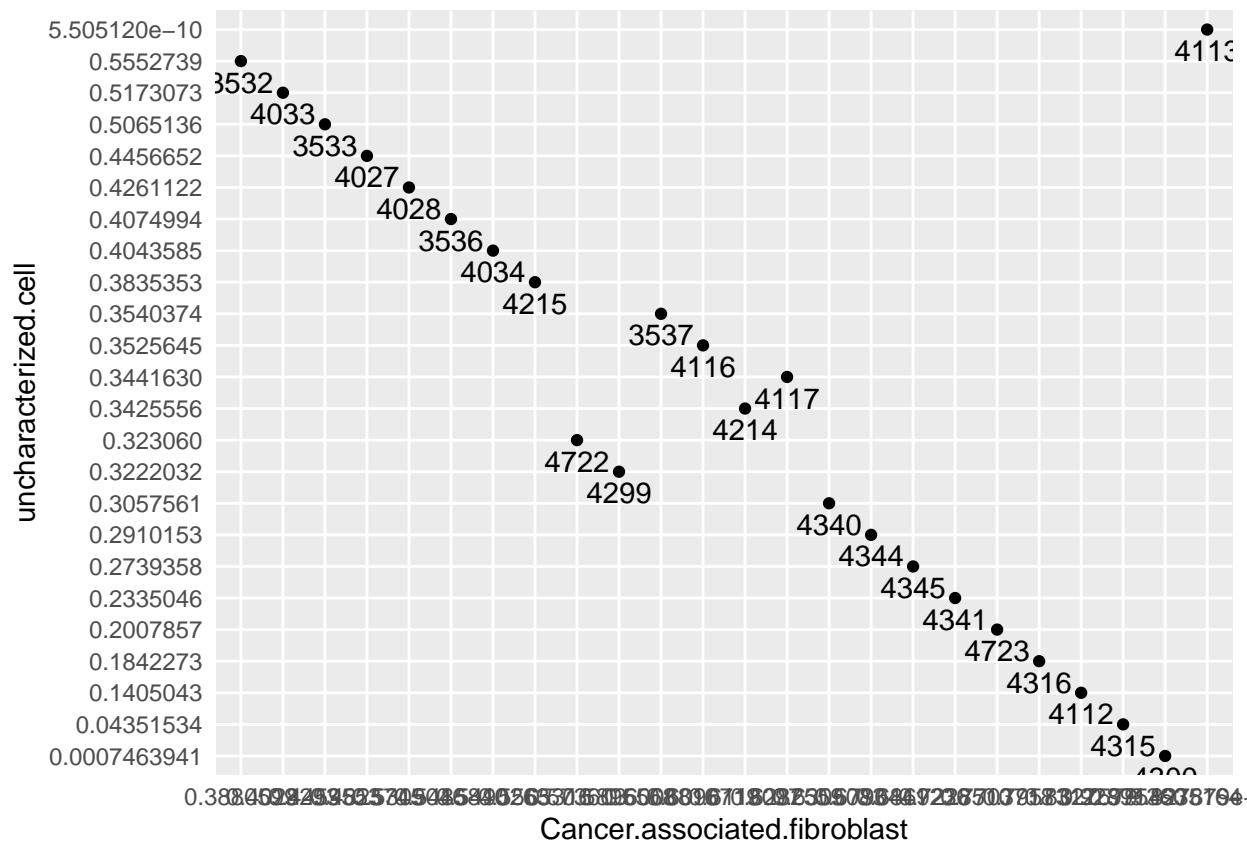
```
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.9974334 -0.9858799
## sample estimates:
##      cor
## -0.9939729
```

```
as.numeric(deconvolution_epic[which(deconvolution_epic$cell_type == "Cancer associated fibroblast"),c(2
```

```
## [1] 0.3880599 0.4459553 0.5485840 0.6008816 0.4825745 0.5309046 0.4028293
## [8] 0.5490263 0.8327579 0.9827879 0.6090719 0.6282559 0.6118097 0.5565316
## [15] 0.5895568 0.9754935 0.9289136 0.7957312 0.6305083 0.7228510 0.6790441
## [22] 0.6869236 0.5736030 0.7703718
```

```
#cor.test(cibersort_caf_subpopulation_results$S1, as.numeric(deconvolution_epic[which(deconvolution_epi
```

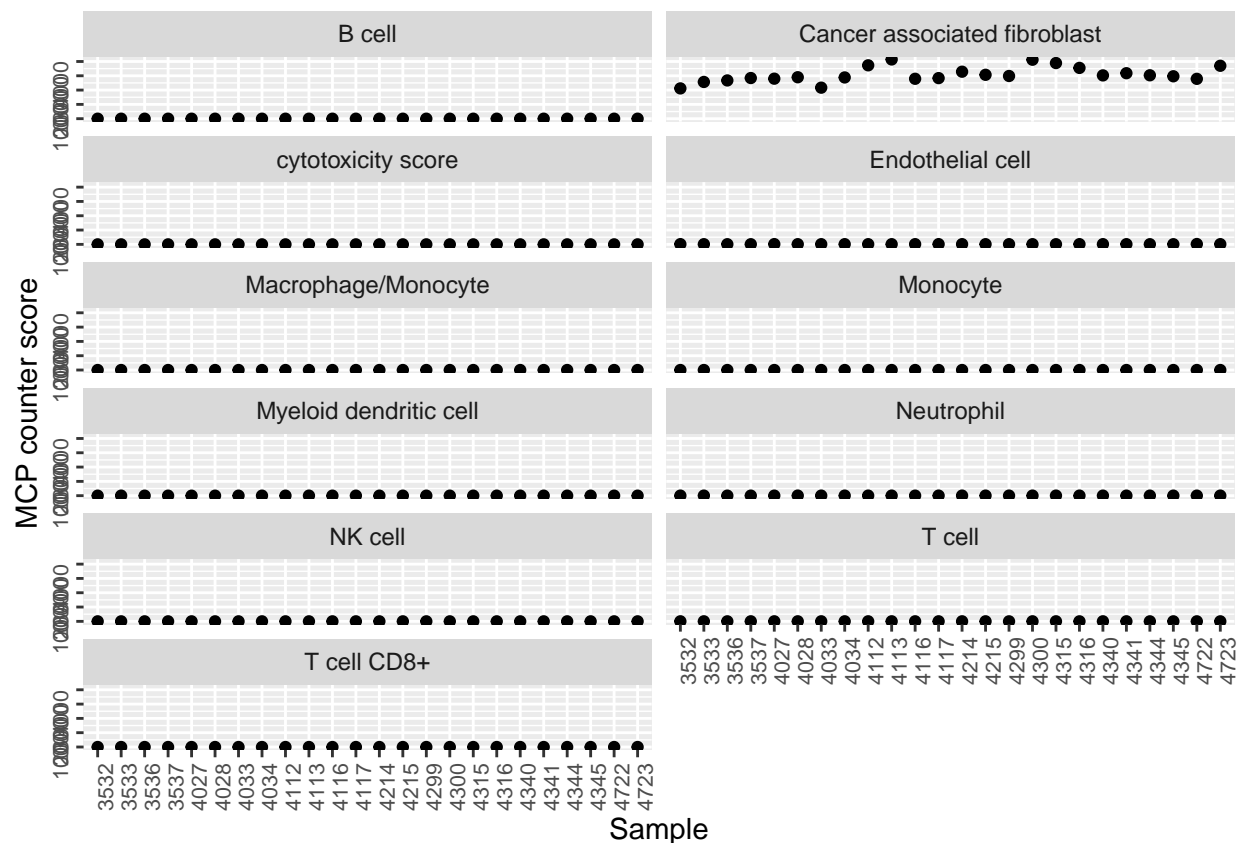
```
#deconvolution_epic_filter_long <- deconvolution_epic %>% dplyr::filter(cell_type %in% c("Cancer associ
deconvolution_epic_filter <- deconvolution_epic %>% dplyr::filter(cell_type %in% c("Cancer associated f
deconvolution_epic_filter <- t(deconvolution_epic_filter)
colnames(deconvolution_epic_filter) <- deconvolution_epic_filter[1,]
deconvolution_epic_filter <- data.frame(deconvolution_epic_filter[-c(1),])
deconvolution_epic_filter <- deconvolution_epic_filter %>% mutate(Sample = rownames(deconvolution_epic_
ggplot(data = deconvolution_epic_filter) +
  geom_point(mapping = aes(x = Cancer.associated.fibroblast, y = uncharacterized.cell)) +
  theme(#axis.text.x=element_blank(), #remove x axis labels
        axis.ticks.x=element_blank(), #remove x axis ticks
        #axis.text.y=element_blank(), #remove y axis labels
        axis.ticks.y=element_blank() #remove y axis ticks
        ) +
  #geom_text(data=subset(deconvolution_epic_filter, Sample == "4113"), aes(x = Cancer.associated.fibroblast, y = uncharacterized.cell))
  geom_text(data=deconvolution_epic_filter, aes(x = Cancer.associated.fibroblast, y = uncharacterized.cell))
```



```
cibersort_caf_subpopulation_results <- read.csv("/home/rstudio/Documents/PhD/subtypes/caf-subtype-analysis/cibersort_caf_subpopulation_results.csv")

cibersort_caf_subpopulation_results$Mixture <- gsub("X", "", cibersort_caf_subpopulation_results$Mixture)
colnames(cibersort_caf_subpopulation_results)[1] <- "Sample"
cibersort_caf_subpopulation_results <- cibersort_caf_subpopulation_results %>% dplyr::select(-c("P.value"))

deconvolution_mcp_long <- deconvolution_mcp %>% pivot_longer(!cell_type, names_to = "sample", values_to = "mcp_counter_score")
deconvolution_mcp_long$sample <- gsub("X", replacement = "", deconvolution_mcp_long$sample)
ggplot(deconvolution_mcp_long, aes(x = sample, y = mcp_counter_score)) +
  # Add the facet wrap
  facet_wrap(~ cell_type, ncol = 2) +
  # Add the points
  geom_point() +
  # Add the x-axis label
  xlab("Sample") +
  # Add the y-axis label
  ylab("MCP counter score") +
  theme(axis.text = element_text(size = 8, angle = 90))
```



```
deconvolution_mcp_filter <- data.frame(t(deconvolution_mcp[which(deconvolution_mcp$cell_type == "Cancer associated fibroblast",
colnames(deconvolution_mcp_filter) <- deconvolution_mcp_filter[1,]
deconvolution_mcp_filter <- data.frame(deconvolution_mcp_filter[-1,])
deconvolution_mcp_filter$Sample <- colnames(deconvolution_mcp)[2:ncol(deconvolution_mcp)]
colnames(deconvolution_mcp_filter)[1] <- "mcp_counter_score_CAF"
```

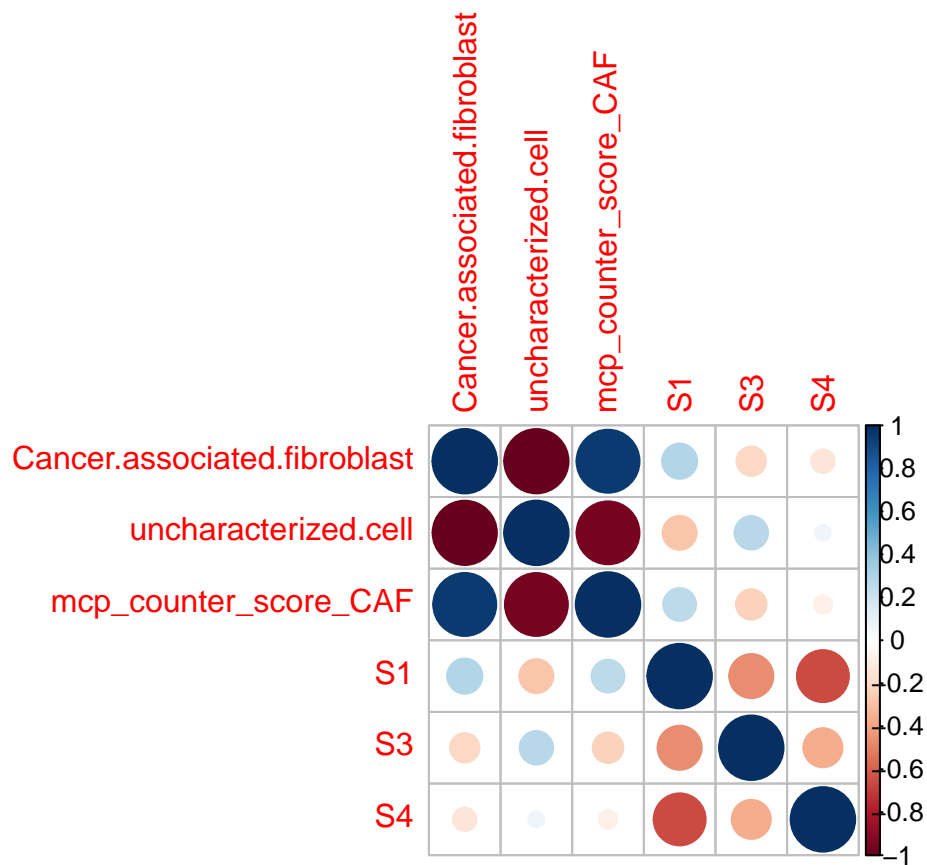
```
deconvolution_mcp_filter
```

```
##      mcp_counter_score_CAF Sample
## 1          2118.187    3532
## 2          2568.089    3533
## 3          2674.509    3536
## 4          2843.439    3537
## 5          2797.128    4027
## 6          2899.125    4028
## 7          2170.477    4033
## 8          2883.104    4034
## 9          3732.086    4112
## 10         4141.333    4113
## 11           2790.22    4116
## 12          2836.76    4117
## 13          3285.481    4214
## 14          3068.483    4215
## 15          2985.898    4299
## 16          4122.946    4300
```

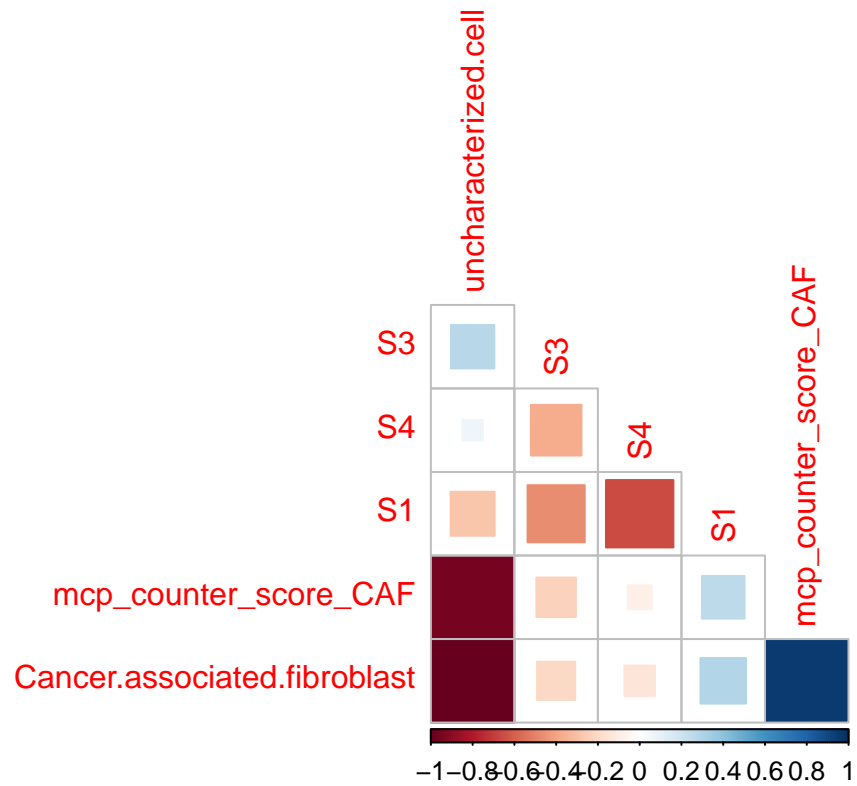
```
## 17          3889.782  4315
## 18          3550.484  4316
## 19          3027.929  4340
## 20          3180.459  4341
## 21          3035.335  4344
## 22          2966.457  4345
## 23          2786.021  4722
## 24          3699.696  4723
```

```
deconvolution_epic_cibersort_mcp_combined <- full_join(deconvolution_epic_filter, deconvolution_mcp_fil
deconvolution_epic_cibersort_mcp_combined <- full_join(deconvolution_epic_cibersort_mcp_combined, ciber
rownames(deconvolution_epic_cibersort_mcp_combined) <- deconvolution_epic_cibersort_mcp_combined$Sample
deconvolution_epic_cibersort_mcp_combined <- deconvolution_epic_cibersort_mcp_combined %>% dplyr::select
```

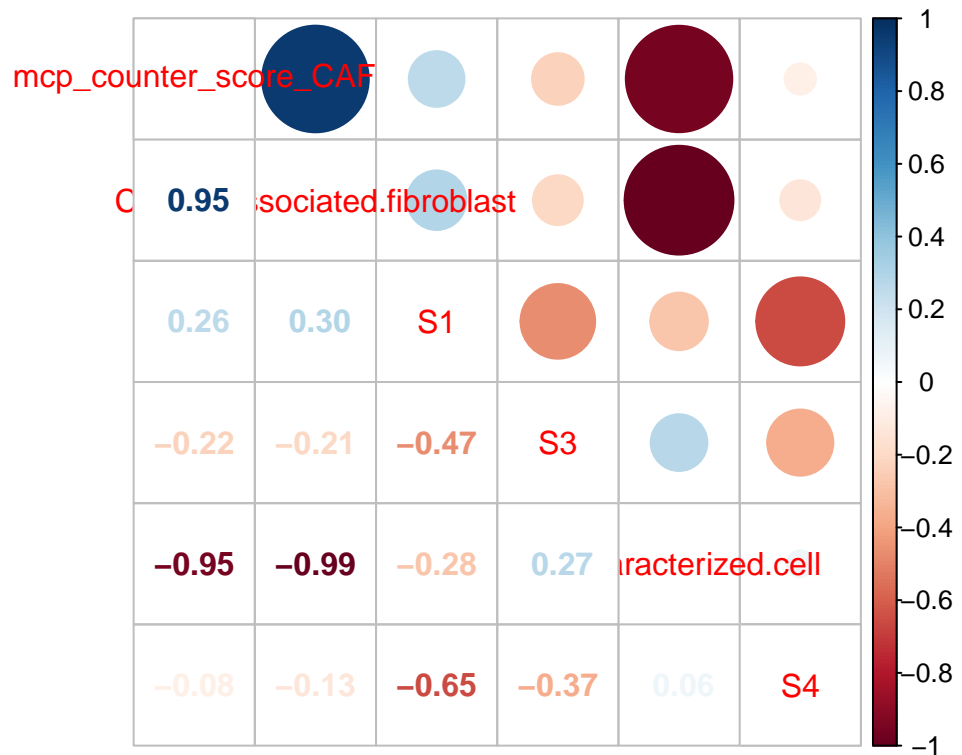
```
corrplot(cor(deconvolution_epic_cibersort_mcp_combined))
```



```
corrplot(cor(deconvolution_epic_cibersort_mcp_combined), method = 'square', order = 'FPC', type = 'lower
```



```
corrplot.mixed(cor(deconvolution_epic_cibersort_mcp_combined), order = 'AOE')
```



```
deconvolution_estimate <- immunedeconv::deconvolute_estimate(salmon_tpm_hgnc_not_duplicated)
```

```
## [1] "Merged dataset includes 9963 genes (449 mismatched)."
```

```
## [1] "1 gene set: StromalSignature overlap= 136"
```

```
## [1] "2 gene set: ImmuneSignature overlap= 140"
```

```
deconvolution_estimate
```

```
##          3532          3533          3536          3537          4027
```

```
## StromalScore -398.9779264 -77.0901415 -367.80715 -234.41848 -421.6918121
```

```
## ImmuneScore -1357.1717989 -1241.8458068 -1266.27719 -1320.35708 -1187.1899556
```

```
## ESTIMATEScore -1756.1497253 -1318.9359483 -1634.08434 -1554.77556 -1608.8817677
```

```
## TumorPurity 0.9403275 0.9165688 0.93408 0.92986 0.9327527
```

```
##          4028          4033          4034          4112
```

```
## StromalScore -310.5104970 -145.7250766 -10.3216652 -20.8256033
```

```
## ImmuneScore -1313.4536825 -1220.6344024 -1155.0647891 -1235.5174420
```

```
## ESTIMATEScore -1623.9641796 -1366.3594790 -1165.3864543 -1256.3430453
```

```
## TumorPurity 0.9335485 0.9193302 0.9073238 0.9128561
```

```
##          4113          4116          4117          4214
```

```
## StromalScore 152.0644980 -300.7698916 -249.6659772 -96.2201331
```

```
## ImmuneScore -1139.3841557 -1288.4770855 -1219.8616524 -1155.4397974
```

```
## ESTIMATEScore -987.3196577 -1589.2469771 -1469.5276296 -1251.6599305
```

```
## TumorPurity 0.8960258 0.9317097 0.9251835 0.9125752
```

```
##          4215          4299          4300          4315
```

```
## StromalScore -172.1903869 -236.2956163 -71.9668837 21.6951624
```

```
## ImmuneScore -1212.7012973 -1171.9712346 -1201.7329345 -1142.4733879
## ESTIMATEScore -1384.8916842 -1408.2668509 -1273.6998182 -1120.7782255
## TumorPurity 0.9203972 0.9217333 0.9138934 0.9045514
## 4316 4340 4341 4344
## StromalScore 30.4199104 -274.1544943 -173.9367732 -255.1282555
## ImmuneScore -1138.2189328 -1236.3081962 -1193.6425982 -1300.0417197
## ESTIMATEScore -1107.7990224 -1510.4626906 -1367.5793713 -1555.1699753
## TumorPurity 0.9037374 0.9274472 0.9194006 0.9298813
## 4345 4722 4723
## StromalScore -367.5866878 -240.7848074 -165.711409
## ImmuneScore -1326.4001046 -981.5805628 -1159.640857
## ESTIMATEScore -1693.9867924 -1222.3653702 -1325.352266
## TumorPurity 0.9371835 0.9108085 0.916945
```

```
deconvolution_xcell_filtered_long_metadata_caf <- deconvolution_xcell_filtered_long_metadata %>% dplyr::
summary(deconvolution_xcell_filtered_long_metadata_caf)
```

```
## cell_type sample xcell_score Patient
## Length:24 Length:24 Min. :0.000000 Min. : 1.00
## Class :character Class :character 1st Qu.:0.001253 1st Qu.: 3.75
## Mode :character Mode :character Median :0.014000 Median : 6.50
## Mean :0.023543 Mean : 6.50
## 3rd Qu.:0.043588 3rd Qu.: 9.25
## Max. :0.075644 Max. :12.00
## Condition Age Size Grade
## Length:24 Min. :45.00 Min. : 8.00 Length:24
## Class :character 1st Qu.:49.50 1st Qu.: 26.50 Class :character
## Mode :character Median :62.00 Median : 40.00 Mode :character
## Mean :63.92 Mean : 43.58
## 3rd Qu.:78.75 3rd Qu.: 52.00
## Max. :84.00 Max. :100.00
## Histology ER PR Her2
## Length:24 Length:24 Length:24 Length:24
## Class :character Class :character Class :character Class :character
## Mode :character Mode :character Mode :character Mode :character
##
##
## Subtype LVI
## Length:24 Length:24
## Class :character Class :character
## Mode :character Mode :character
##
##
```

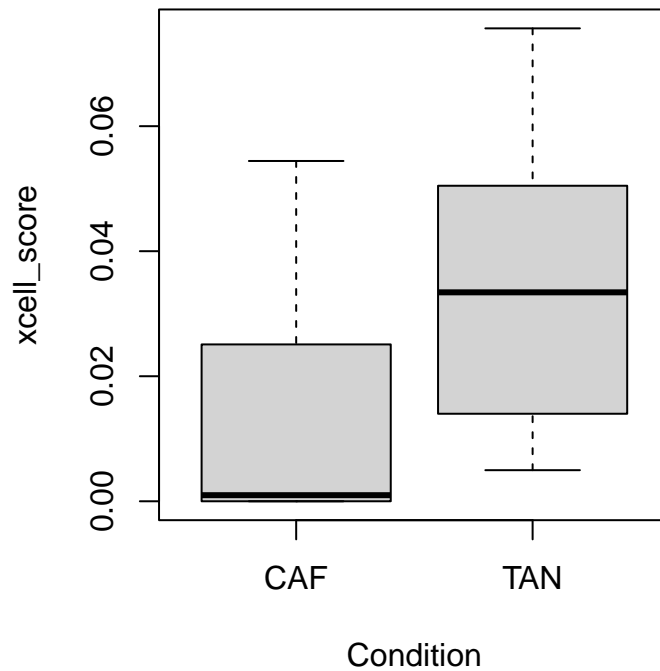
```
caf_xcell <- deconvolution_xcell_filtered_long_metadata_caf$xcell_score[which(deconvolution_xcell_filtered_long_metadata_caf$
tan_xcell <- deconvolution_xcell_filtered_long_metadata_caf$xcell_score[which(deconvolution_xcell_filtered_long_metadata_caf$
cor.test(x = caf_xcell, y = tan_xcell,
method = c("pearson"),
conf.level = 0.95)
```

```
##
```



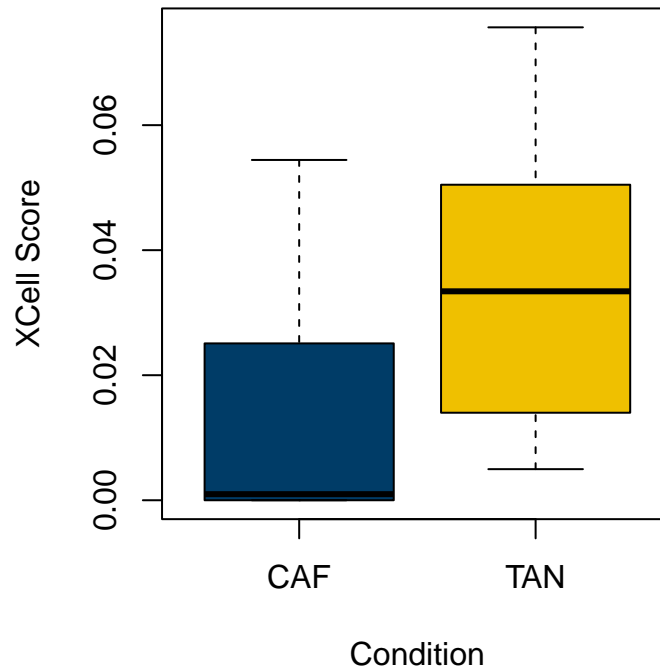
```
## Pearson's product-moment correlation
##
## data:  caf_xcell and tan_xcell
## t = 3.0238, df = 10, p-value = 0.01281
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.1942461 0.9057587
## sample estimates:
##      cor
## 0.6911047
```

```
par(pty = "s")
boxplot(xcell_score ~ Condition, data = deconvolution_xcell_filtered_long_metadata_caf)
```



```
boxplot(xcell_score ~ Condition,
        col = c("#003C67FF", "#EFC000FF"),
        main = "XCell CAF score InHouse CAF vs TAN",
        xlab = "Condition", ylab = "XCell Score", data = deconvolution_xcell_filtered_long_metadata_caf)
```

## XCell CAF score InHouse CAF vs TAN



```
diff = caf_xcell - tan_xcell
summary(diff)
```

```
##      Min.   1st Qu.   Median     Mean  3rd Qu.     Max.
## -0.050423 -0.034136 -0.022248 -0.021894 -0.011600  0.008418
```

```
bartlett.test(xcell_score ~ Condition, data = deconvolution_xcell_filtered_long_metadata_caf)
```

```
##
## Bartlett test of homogeneity of variances
##
## data:  xcell_score by Condition
## Bartlett's K-squared = 0.1614, df = 1, p-value = 0.6879
```

```
t.test(formula = xcell_score ~ Condition,
       alternative = "two.sided",
       mu = 0,
       paired = TRUE,
       var.equal = TRUE,
       conf.level = 0.95, data = deconvolution_xcell_filtered_long_metadata_caf)
```

```
##
## Paired t-test
##
```

```
## data: xcell_score by Condition
## t = -4.4452, df = 11, p-value = 0.0009865
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -0.03273521 -0.01105366
## sample estimates:
## mean difference
## -0.02189443
```

```
deconvolution_epic_filtered_long_metadata
```

```
## # A tibble: 48 x 14
##   cell_type      sample epic_score Patient Condition   Age   Size Grade Histology
##   <chr>         <chr>      <dbl>   <int> <chr>      <int> <int> <chr> <chr>
## 1 Cancer assoc~ 3532      0.388     9 CAF        48    16 Grad~ Ductal
## 2 Cancer assoc~ 3533      0.446     9 TAN        48    16 Grad~ Ductal
## 3 Cancer assoc~ 3536      0.549    10 CAF        50    52 Grad~ Lobular
## 4 Cancer assoc~ 3537      0.601    10 TAN        50    52 Grad~ Lobular
## 5 Cancer assoc~ 4027      0.483     2 CAF        77    40 Grad~ Ductal
## 6 Cancer assoc~ 4028      0.531     2 TAN        77    40 Grad~ Ductal
## 7 Cancer assoc~ 4033      0.403     1 CAF        46    45 Grad~ Lobular
## 8 Cancer assoc~ 4034      0.549     1 TAN        46    45 Grad~ Lobular
## 9 Cancer assoc~ 4112      0.833     3 CAF        62    12 Grad~ Ductal
## 10 Cancer assoc~ 4113      0.983     3 TAN        62     8 Grad~ Ductal
## # i 38 more rows
## # i 5 more variables: ER <chr>, PR <chr>, Her2 <chr>, Subtype <chr>, LVI <chr>
```

```
deconvolution_epic_filtered_long_metadata_caf <- deconvolution_epic_filtered_long_metadata %>% dplyr::f
summary(deconvolution_epic_filtered_long_metadata_caf)
```

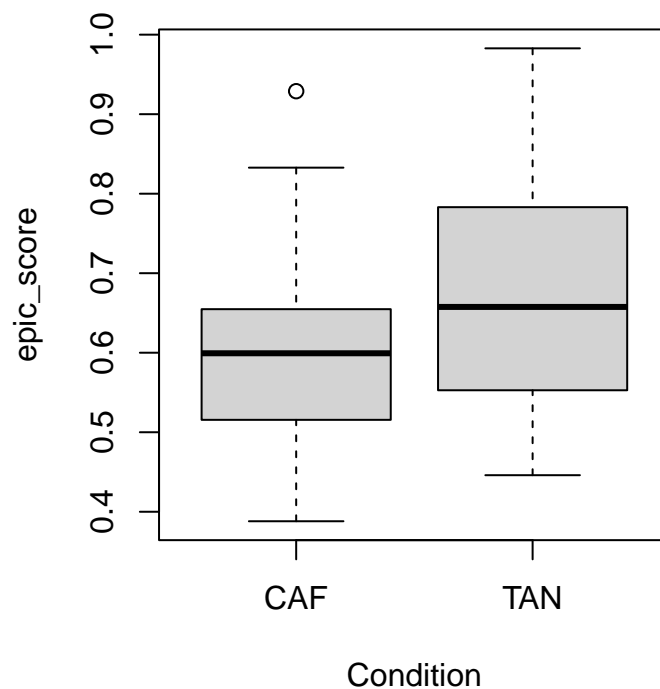
```
##   cell_type      sample      epic_score      Patient
## Length:24      Length:24      Min.   :0.3881  Min.   : 1.00
## Class :character Class :character 1st Qu.:0.5489 1st Qu.: 3.75
## Mode  :character Mode  :character Median :0.6104 Median : 6.50
##                                     Mean  :0.6468 Mean  : 6.50
##                                     3rd Qu.:0.7347 3rd Qu.: 9.25
##                                     Max.   :0.9828 Max.   :12.00
##   Condition      Age      Size      Grade
## Length:24      Min.   :45.00  Min.   : 8.00  Length:24
## Class :character 1st Qu.:49.50  1st Qu.: 26.50 Class :character
## Mode  :character Median :62.00  Median : 40.00 Mode  :character
##                                     Mean  :63.92  Mean  : 43.58
##                                     3rd Qu.:78.75 3rd Qu.: 52.00
##                                     Max.   :84.00  Max.   :100.00
##   Histology      ER      PR      Her2
## Length:24      Length:24      Length:24      Length:24
## Class :character Class :character Class :character Class :character
## Mode  :character Mode  :character Mode  :character Mode  :character
##
##
##   Subtype      LVI
## Length:24      Length:24
```

```
## Class :character    Class :character
## Mode  :character    Mode  :character
##
##
##
```

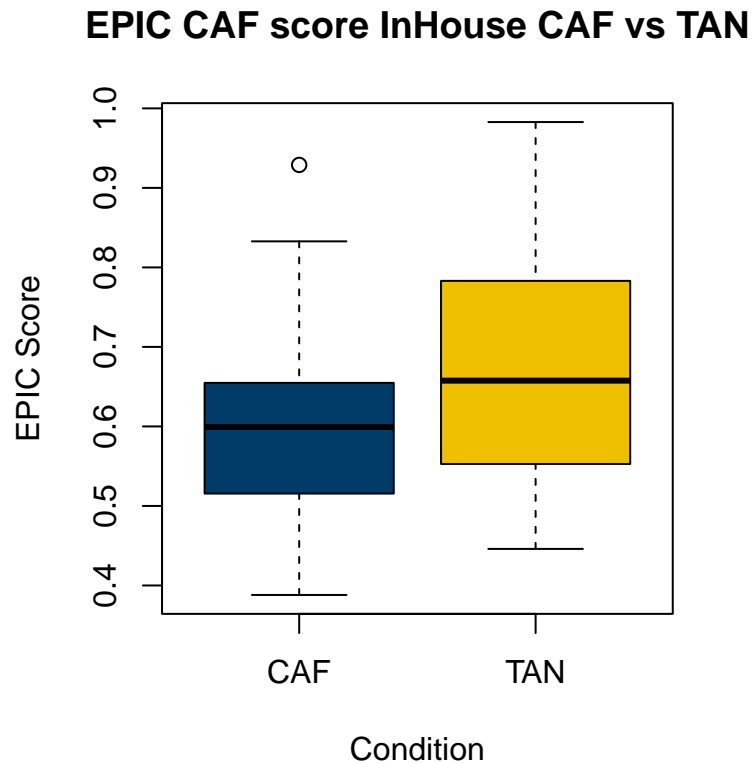
```
caf_epic <- deconvolution_epic_filtered_long_metadata_caf$epic_score[which(deconvolution_epic_filtered_
tan_epic <- deconvolution_epic_filtered_long_metadata_caf$epic_score[which(deconvolution_epic_filtered_
cor.test(x = caf_epic, y = tan_epic,
        method = c("pearson"),
        conf.level = 0.95)
```

```
##
## Pearson's product-moment correlation
##
## data:  caf_epic and tan_epic
## t = 2.9167, df = 10, p-value = 0.01539
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.1703742 0.9012231
## sample estimates:
##          cor
## 0.6779839
```

```
par(pty = "s")
boxplot(epic_score ~ Condition, data = deconvolution_epic_filtered_long_metadata_caf)
```



```
boxplot(epic_score ~ Condition,
        col = c("#003C67FF", "#EFC000FF"),
        main = "EPIC CAF score InHouse CAF vs TAN",
        xlab = "Condition", ylab = "EPIC Score", data = deconvolution_epic_filtered_long_metadata_caf)
```



```
bartlett.test(epic_score ~ Condition, data = deconvolution_epic_filtered_long_metadata_caf)
```

```
##
## Bartlett test of homogeneity of variances
##
## data: epic_score by Condition
## Bartlett's K-squared = 0.075341, df = 1, p-value = 0.7837
```

```
t.test(formula = epic_score ~ Condition,
        alternative = "two.sided",
        mu = 0,
        paired = TRUE,
        var.equal = TRUE,
        conf.level = 0.95, data = deconvolution_epic_filtered_long_metadata_caf)
```

```
##
## Paired t-test
##
## data: epic_score by Condition
```

```
## t = -2.1183, df = 11, p-value = 0.05774
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -0.164548496 0.003148298
## sample estimates:
## mean difference
## -0.0807001
```

```
deconvolution_mcp_filtered_long_metadata
```

```
## # A tibble: 48 x 14
##   cell_type      sample mcp_score Patient Condition Age Size Grade Histology
##   <chr>          <chr>      <dbl>   <int> <chr>      <int> <int> <chr> <chr>
## 1 Endothelial c~ 3532      14.2      9 CAF        48    16 Grad~ Ductal
## 2 Endothelial c~ 3533      11.4      9 TAN        48    16 Grad~ Ductal
## 3 Endothelial c~ 3536      10.0     10 CAF        50    52 Grad~ Lobular
## 4 Endothelial c~ 3537       9.13     10 TAN        50    52 Grad~ Lobular
## 5 Endothelial c~ 4027      16.6      2 CAF        77    40 Grad~ Ductal
## 6 Endothelial c~ 4028      11.9      2 TAN        77    40 Grad~ Ductal
## 7 Endothelial c~ 4033      11.6      1 CAF        46    45 Grad~ Lobular
## 8 Endothelial c~ 4034      12.8      1 TAN        46    45 Grad~ Lobular
## 9 Endothelial c~ 4112      10.9      3 CAF        62    12 Grad~ Ductal
## 10 Endothelial c~ 4113      11.2      3 TAN        62     8 Grad~ Ductal
## # i 38 more rows
## # i 5 more variables: ER <chr>, PR <chr>, Her2 <chr>, Subtype <chr>, LVI <chr>
```

```
deconvolution_compare_fibroblast_score_caf_tan <- function(df, score_column) {
  df_caf <- df %>% dplyr::filter(cell_type == "Cancer associated fibroblast")
  caf_score <- df_caf[[score_column]][which(df_caf$Condition == "CAF")]
  tan_score <- df_caf[[score_column]][which(df_caf$Condition == "TAN")]
  print("carrying out correlation test...")
  print(cor.test(x = caf_score, y = tan_score,
    method = c("pearson"),
    conf.level = 0.95))

  plt_title <- paste(score_column, " cancer-associated fibroblast for inhouse CAF vs TAN")
  par(pty = "s")
  #boxplot(score_column ~ Condition, data = df_caf)
  #plot_out <- boxplot(df_caf[,score_column] ~ df_caf[,Condition],
  #   col = c("#003C67FF", "#EFC000FF"),
  #   main = plt_title,
  #   xlab = "Condition", ylab = score_column)
  print(df_caf)
  plot_out <- ggplot(data = df_caf, aes(Condition, .data[[score_column]])) +
    geom_boxplot(outlier.colour="red", outlier.shape=8, outlier.size=4)

  bartlet_out <- bartlett.test(df_caf[[score_column]] ~ df_caf$Condition, data = df_caf)
  if (bartlet_out$p.value > 0.05){
    print("variances equal, carry out t-test")
    t.test.out <- t.test(formula = df_caf[[score_column]] ~ df_caf$Condition,
      alternative = "two.sided",
      mu = 0,
      paired = TRUE,
      var.equal = TRUE,
```

```

      conf.level = 0.95, data = df_caf)
    }
    outputs <- list(plot_out, bartlet_out, t.test.out)

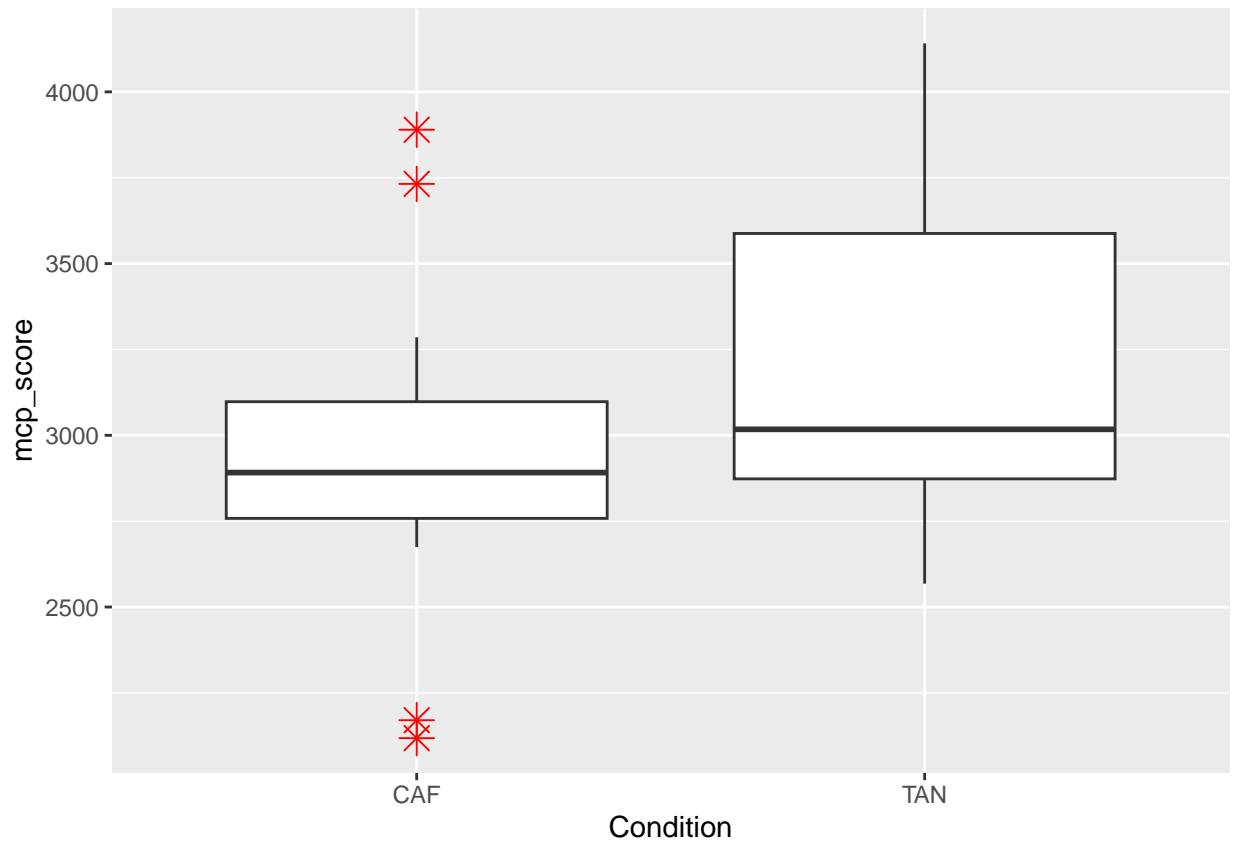
    return(outputs)
  }

out_mcp <- deconvolution_compare_fibroblast_score_caf_tan(deconvolution_mcp_filtered_long_metadata, "mcp")

## [1] "carrying out correlation test..."
##
## Pearson's product-moment correlation
##
## data:  caf_score and tan_score
## t = 2.5875, df = 10, p-value = 0.02707
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.09324848 0.88538684
## sample estimates:
##      cor
## 0.6332609
##
## # A tibble: 24 x 14
##   cell_type      sample mcp_score Patient Condition  Age  Size Grade Histology
##   <chr>         <chr>      <dbl>   <int> <chr>      <int> <int> <chr> <chr>
## 1 Cancer associ~ 3532      2118.     9 CAF        48    16 Grad~ Ductal
## 2 Cancer associ~ 3533      2568.     9 TAN        48    16 Grad~ Ductal
## 3 Cancer associ~ 3536      2675.    10 CAF        50    52 Grad~ Lobular
## 4 Cancer associ~ 3537      2843.    10 TAN        50    52 Grad~ Lobular
## 5 Cancer associ~ 4027      2797.     2 CAF        77    40 Grad~ Ductal
## 6 Cancer associ~ 4028      2899.     2 TAN        77    40 Grad~ Ductal
## 7 Cancer associ~ 4033      2170.     1 CAF        46    45 Grad~ Lobular
## 8 Cancer associ~ 4034      2883.     1 TAN        46    45 Grad~ Lobular
## 9 Cancer associ~ 4112      3732.     3 CAF        62    12 Grad~ Ductal
## 10 Cancer associ~ 4113      4141.     3 TAN        62     8 Grad~ Ductal
## # i 14 more rows
## # i 5 more variables: ER <chr>, PR <chr>, Her2 <chr>, Subtype <chr>, LVI <chr>
## [1] "variances equal, carry out t-test"

out_mcp[[1]]

```



```
out_mcp[[2]]
```

```
##
## Bartlett test of homogeneity of variances
##
## data: df_caf[[score_column]] by df_caf$Condition
## Bartlett's K-squared = 0.00074082, df = 1, p-value = 0.9783
```

```
out_mcp[[3]]
```

```
##
## Paired t-test
##
## data: df_caf[[score_column]] by df_caf$Condition
## t = -2.2206, df = 11, p-value = 0.04831
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -575.333038 -2.553832
## sample estimates:
## mean difference
## -288.9434
```

```
deconvolution_compare_celltype_score_caf_tan <- function(df, score_column, cell_type_in) {
  df_cell_type <- df %>% dplyr::filter(cell_type == cell_type_in)
```



```

    caf_score <- df_cell_type[[score_column]][which(df_cell_type$Condition == "CAF")]
    tan_score <- df_cell_type[[score_column]][which(df_cell_type$Condition == "TAN")]
    print("carrying out correlation test...")
    print(cor.test(x = caf_score, y = tan_score,
                  method = c("pearson"),
                  conf.level = 0.95))
    plot_out <- ggplot(data = df_cell_type, aes(Condition, .data[[score_column]])) +
      geom_boxplot(outlier.colour="red", outlier.shape=8, outlier.size=4)

    bartlet_out <- bartlett.test(df_cell_type[[score_column]] ~ df_cell_type$Condition, data = df_cell_type)
    print(bartlet_out)
    if (bartlet_out$p.value > 0.05) {
      print("variances equal, carry out t-test equal variance")
      t.test.out <- t.test(formula = df_cell_type[[score_column]] ~ df_cell_type$Condition,
                          alternative = "two.sided",
                          mu = 0,
                          paired = TRUE,
                          var.equal = TRUE,
                          conf.level = 0.95, data = df_cell_type)
    } else {
      print("variances not equal, carry out t-test unequal variance")
      t.test.out <- t.test(formula = df_cell_type[[score_column]] ~ df_cell_type$Condition,
                          alternative = "two.sided",
                          mu = 0,
                          paired = TRUE,
                          var.equal = FALSE,
                          conf.level = 0.95, data = df_cell_type)
    }

    outputs <- list(plot_out, bartlet_out, t.test.out)
    return(outputs)
}
deconvolution_compare_celltype_score_caf_tan(deconvolution_mcp_filtered_long_metadata, "mcp_score", "End")

```

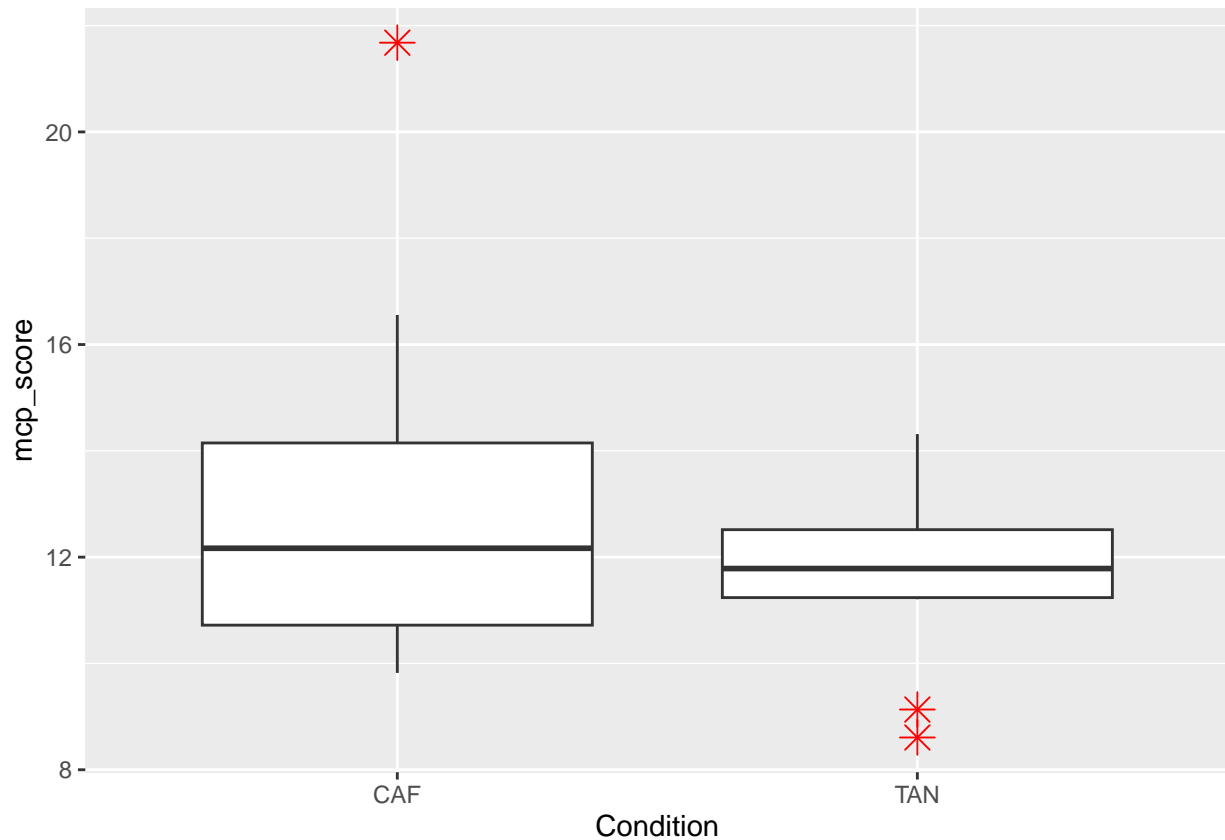
```

## [1] "carrying out correlation test..."
##
## Pearson's product-moment correlation
##
## data:  caf_score and tan_score
## t = 1.437, df = 10, p-value = 0.1813
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## -0.2100771  0.7981123
## sample estimates:
##      cor
## 0.4137019
##
## Bartlett test of homogeneity of variances
##
## data:  df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 5.9468, df = 1, p-value = 0.01474
##

```

```
## [1] "variances not equal, carry out t-test unequal variance"
```

```
## [[1]]
```

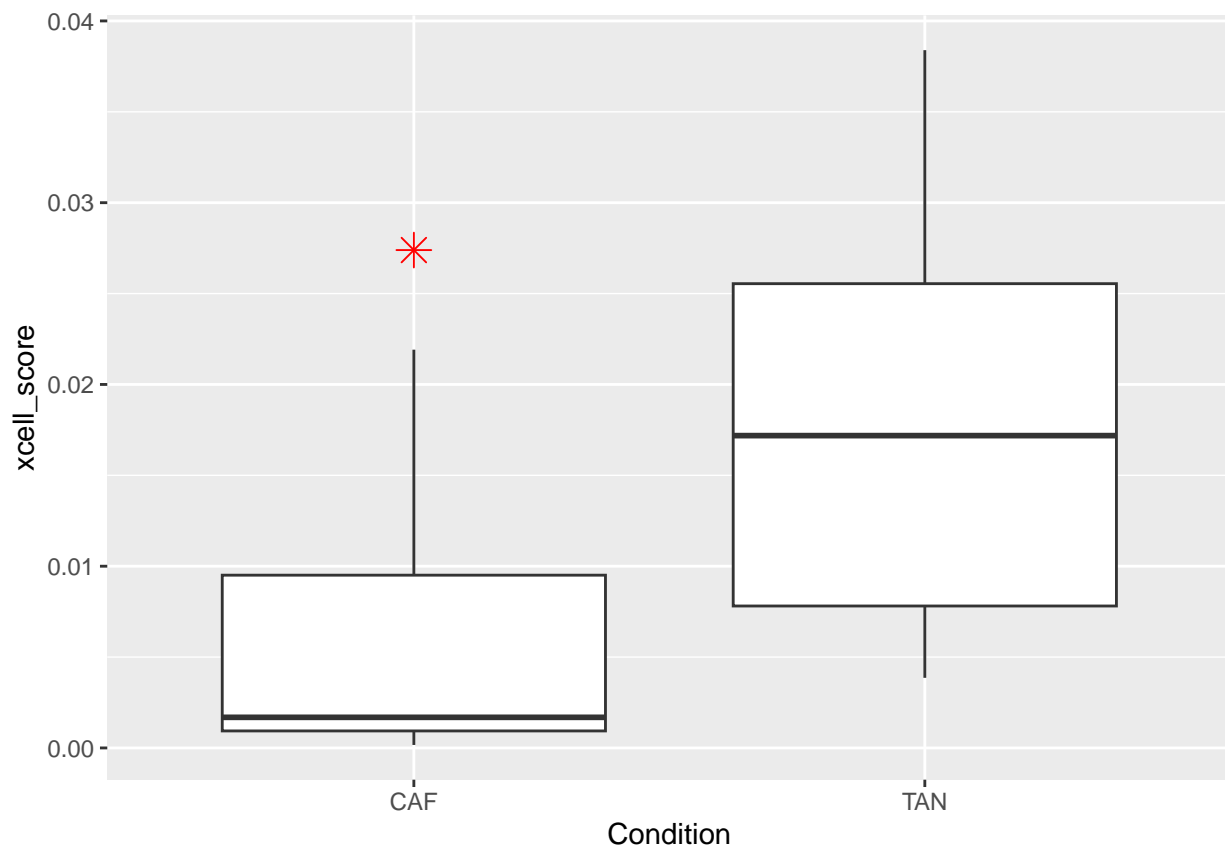


```
##
## [[2]]
##
## Bartlett test of homogeneity of variances
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 5.9468, df = 1, p-value = 0.01474
##
##
## [[3]]
##
## Paired t-test
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## t = 1.5153, df = 11, p-value = 0.1579
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -0.6135207 3.3251092
## sample estimates:
## mean difference
## 1.355794
```

```
deconvolution_compare_celltype_score_caf_tan(deconvolution_xcell_filtered_long_metadata, "xcell_score",
```

```
## [1] "carrying out correlation test..."
##
## Pearson's product-moment correlation
##
## data:  caf_score and tan_score
## t = 3.2315, df = 10, p-value = 0.008998
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  0.2387499 0.9138004
## sample estimates:
##      cor
## 0.7147212
##
## Bartlett test of homogeneity of variances
##
## data:  df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 0.15337, df = 1, p-value = 0.6953
##
## [1] "variances equal, carry out t-test equal variance"

## [[1]]
```



```

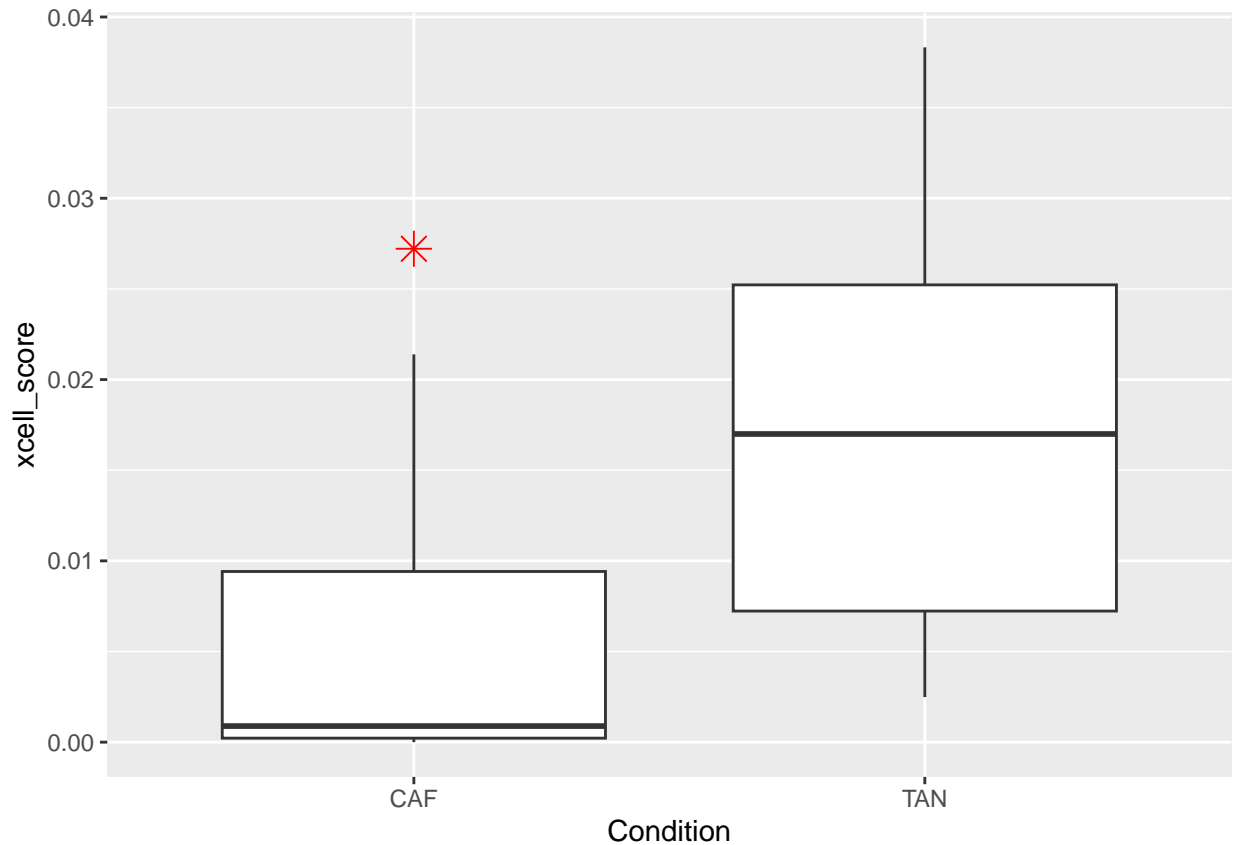
##
## [[2]]
##
## Bartlett test of homogeneity of variances
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 0.15337, df = 1, p-value = 0.6953
##
##
## [[3]]
##
## Paired t-test
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## t = -4.7058, df = 11, p-value = 0.0006441
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -0.015933207 -0.005778311
## sample estimates:
## mean difference
## -0.01085576

deconvolution_compare_celltype_score_caf_tan(deconvolution_xcell_filtered_long_metadata, "xcell_score",

## [1] "carrying out correlation test..."
##
## Pearson's product-moment correlation
##
## data: caf_score and tan_score
## t = 3.018, df = 10, p-value = 0.01294
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
## 0.1929609 0.9055186
## sample estimates:
## cor
## 0.6904065
##
## Bartlett test of homogeneity of variances
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 0.20576, df = 1, p-value = 0.6501
##
## [1] "variances equal, carry out t-test equal variance"

## [[1]]

```



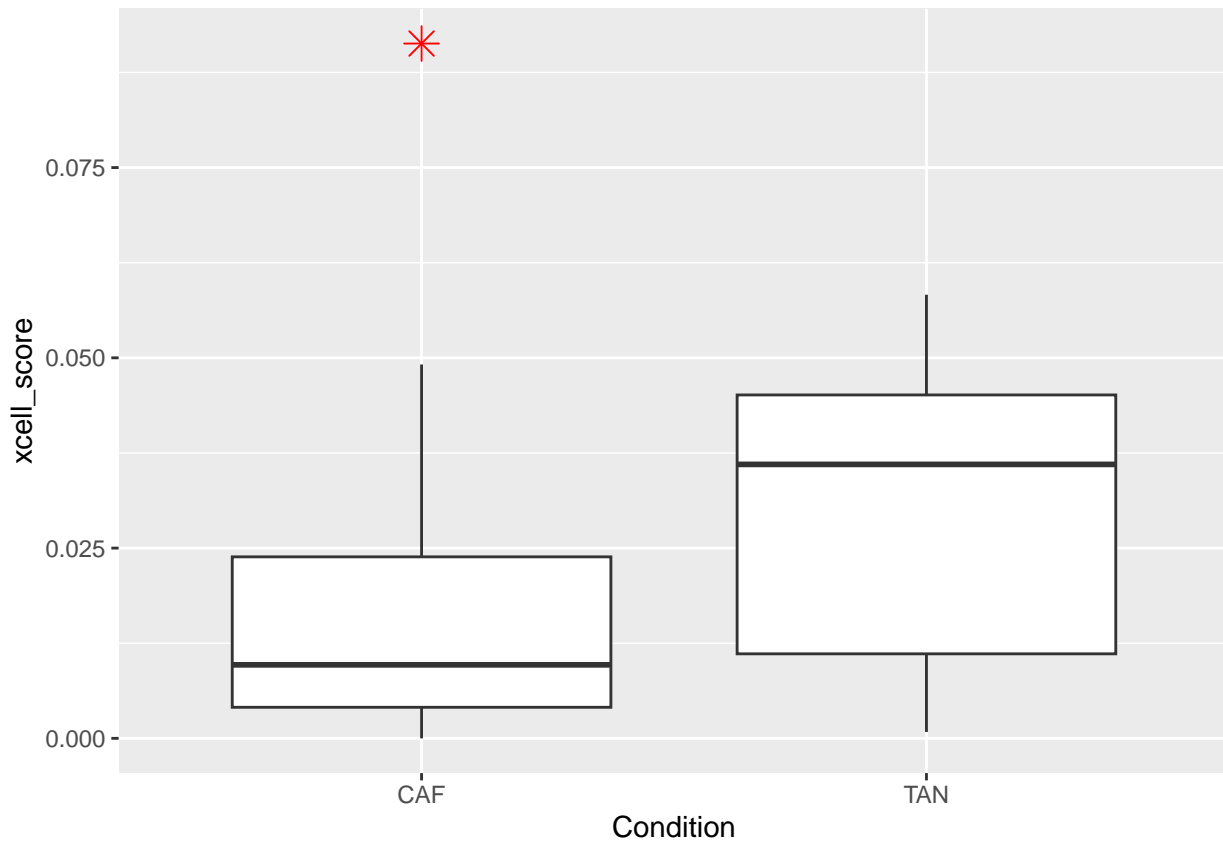
```
##
## [[2]]
##
## Bartlett test of homogeneity of variances
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 0.20576, df = 1, p-value = 0.6501
##
##
## [[3]]
##
## Paired t-test
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## t = -4.4415, df = 11, p-value = 0.0009926
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -0.016396379 -0.005530487
## sample estimates:
## mean difference
## -0.01096343
```

```
deconvolution_compare_celltype_score_caf_tan(deconvolution_xcell_filtered_long_metadata, "xcell_score",
```

```
## [1] "carrying out correlation test..."
```

```
##
## Pearson's product-moment correlation
##
## data:  caf_score and tan_score
## t = 0.66391, df = 10, p-value = 0.5218
## alternative hypothesis: true correlation is not equal to 0
## 95 percent confidence interval:
##  -0.4176870  0.6971612
## sample estimates:
##      cor
## 0.2054675
##
##
## Bartlett test of homogeneity of variances
##
## data:  df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 0.85096, df = 1, p-value = 0.3563
##
## [1] "variances equal, carry out t-test equal variance"

## [[1]]
```



```
##
## [[2]]
##
```

```
## Bartlett test of homogeneity of variances
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## Bartlett's K-squared = 0.85096, df = 1, p-value = 0.3563
##
##
## [[3]]
##
## Paired t-test
##
## data: df_cell_type[[score_column]] by df_cell_type$Condition
## t = -1.1102, df = 11, p-value = 0.2906
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -0.028307954 0.009325737
## sample estimates:
## mean difference
## -0.009491109
```

#### metadata

```
## sample Patient Condition Age Size Grade Histology ER PR
## 1 4033 1 CAF 46 45 Grade_2 Lobular ER_positive PR_positive
## 2 4034 1 TAN 46 45 Grade_2 Lobular ER_positive PR_positive
## 3 4027 2 CAF 77 40 Grade_3 Ductal ER_negative PR_negative
## 4 4028 2 TAN 77 40 Grade_3 Ductal ER_negative PR_negative
## 5 4112 3 CAF 62 12 Grade_3 Ductal ER_positive PR_negative
## 6 4113 3 TAN 62 8 Grade_3 Ductal ER_positive PR_negative
## 7 4116 4 CAF 45 35 Grade_2 Lobular ER_positive PR_positive
## 8 4117 4 TAN 45 13 Grade_2 Lobular ER_positive PR_positive
## 9 4214 5 CAF 78 90 Grade_2 Lobular ER_positive PR_negative
## 10 4215 5 TAN 78 90 Grade_2 Lobular ER_positive PR_negative
## 11 4315 6 CAF 84 30 Grade_2 Ductal ER_positive PR_positive
## 12 4316 6 TAN 84 22 Grade_2 Ductal ER_positive PR_positive
## 13 4340 7 CAF 62 100 Grade_2 Lobular ER_positive PR_positive
## 14 4341 7 TAN 62 100 Grade_2 Lobular ER_positive PR_positive
## 15 4344 8 CAF 50 28 Grade_2 Ductal ER_positive PR_positive
## 16 4345 8 TAN 50 28 Grade_2 Ductal ER_positive PR_positive
## 17 3532 9 CAF 48 16 Grade_2 Ductal ER_positive PR_positive
## 18 3533 9 TAN 48 16 Grade_2 Ductal ER_positive PR_positive
## 19 3536 10 CAF 50 52 Grade_3 Lobular ER_positive PR_positive
## 20 3537 10 TAN 50 52 Grade_3 Lobular ER_positive PR_positive
## 21 4299 11 CAF 84 40 Grade_3 Ductal ER_positive PR_positive
## 22 4300 11 TAN 84 40 Grade_3 Ductal ER_positive PR_positive
## 23 4722 12 CAF 81 52 Grade_2 Lobular ER_positive PR_negative
## 24 4723 12 TAN 81 52 Grade_2 Lobular ER_positive PR_negative
##
## Her2 Subtype LVI
## 1 Her2_negative LuminalA LVI_negative
## 2 Her2_negative LuminalA LVI_negative
## 3 Her2_negative TNBC LVI_positive
## 4 Her2_negative TNBC LVI_positive
## 5 Her2_negative LuminalA LVI_negative
## 6 Her2_negative LuminalA LVI_negative
## 7 Her2_negative LuminalA LVI_positive
```

```
## 8 Her2_negative LuminalA LVI_positive
## 9 Her2_negative LuminalA LVI_positive
## 10 Her2_negative LuminalA LVI_positive
## 11 Her2_negative LuminalA LVI_positive
## 12 Her2_negative LuminalA LVI_positive
## 13 Her2_negative LuminalA LVI_negative
## 14 Her2_negative LuminalA LVI_negative
## 15 Her2_negative LuminalA LVI_negative
## 16 Her2_negative LuminalA LVI_negative
## 17 Her2_negative LuminalA LVI_negative
## 18 Her2_negative LuminalA LVI_negative
## 19 Her2_negative LuminalA LVI_negative
## 20 Her2_negative LuminalA LVI_negative
## 21 Her2_negative LuminalA LVI_positive
## 22 Her2_negative LuminalA LVI_positive
## 23 Her2_negative LuminalA LVI_negative
## 24 Her2_negative LuminalA LVI_negative
```

```
salmon_markers <- data.frame(t(salmon_tpm_hgnc_not_duplicated[c("ACTA2", "FAP"),]))
salmon_markers$sample <- rownames(salmon_markers)
metadata_markers <- full_join(metadata, salmon_markers)
```

```
## Joining with 'by = join_by(sample)'
```

```
# svg("/home/rstudio/Documents/PhD/notes/mini_viva_report/images/current_research/figure3/xcell_deconv_
# xcell_plot
# dev.off()
```

```
#svg("/home/rstudio/Documents/PhD/notes/mini_viva_report/images/current_research/figure3/epic_deconv_ca
# epic_plot_stack
# dev.off()
```

```
# svg("/home/rstudio/Documents/PhD/notes/mini_viva_report/images/current_research/figure3/mcp_deconv_ca
# mcp_plot
# dev.off()
```