Census notebook

```
library(Seurat)

## Attaching SeuratObject
library(data.table)
library(Matrix)
library(ggplot2)
source("census.R")
```

Load Data

Run Census (monocle version) on complete data

write command that created the file to create a valid file.

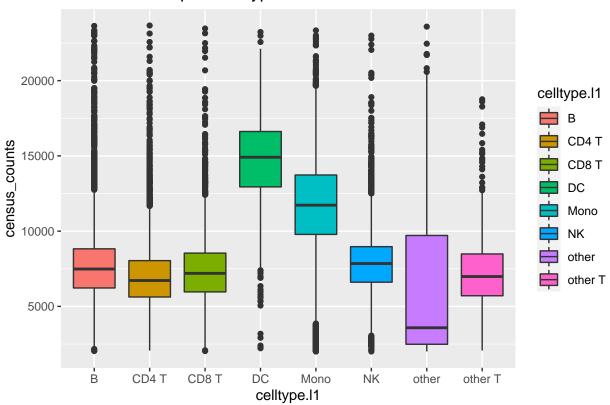
```
#only works on norm
#out_monocle <- as.data.frame(census(matrix = mat, ncores = 2, method = "monocle"))
#colnames(out_monocle) <- c("census_counts")
#df <- merge(out_monocle, meta, by.x=0, by.y="V1")
df <- fread("../../Data/Hao (CITEseq-PBMC)/census_meta.tsv")

## Warning in fread("../../Data/Hao (CITEseq-PBMC)/census_meta.tsv"): Detected
## 15 column names but the data has 16 columns (i.e. invalid file). Added 1 extra
## default column name for the first column which is guessed to be row names or an
## index. Use setnames() afterwards if this guess is not correct, or fix the file</pre>
```

Census counts per cell-type

```
ggplot(df[!is.na(df$census_counts),], aes(y=census_counts,x=celltype.l1,fill=celltype.l1))+
   geom_boxplot()+
   ggtitle("Census counts per cell-type")
```

Census counts per cell-type

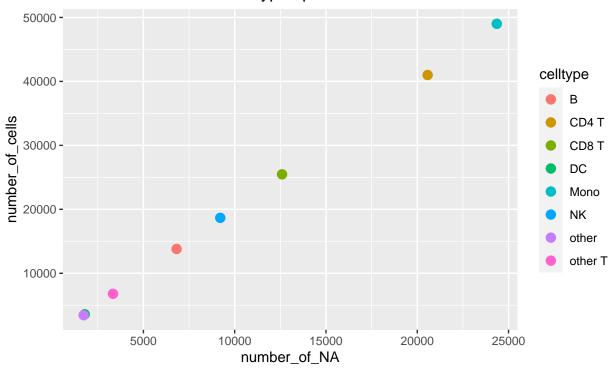


Census produced ${\sim}50\%$ NA values

```
df$isNA <- is.na(df$census_counts)
na_df <- df[,sum(isNA==T),by=celltype.l1]
colnames(na_df) <- c("celltype","number_of_NA")
total_df <- df[,.N,by=celltype.l1]
colnames(total_df) <- c("celltype","number_of_cells")
plot_df <- merge(na_df, total_df, by="celltype")

ggplot(plot_df, aes(x=number_of_NA,y=number_of_cells,color=celltype))+
    geom_point(size=3)+
    ggtitle("Number of NA results by census per cell-type; \nperfect correlation with number of cells per</pre>
```

Number of NA results by census per cell-type; perfect correlation with number of cells per type, which means its not cell-type specific



How are the NAs produced?

(all shown on a 10k cells subset of the dataset) When calculating $\mathbf{x}^*\mathbf{_i}$ (they call it $t\mathbf{_cestimate}$ in their code), they log10 transform the expression values (counts in this case). The range of $\mathbf{x}^*\mathbf{_i}$ can be seen below (for 5k random cells). For the next steps, they only consider the genes with an expression value > 0.1. Later on, they calculate the number of single mRNA cells as all theses cells, which have a lower expression value than $\mathbf{x}^*\mathbf{_i}$. This means if $\mathbf{x}^*\mathbf{_i}$ falls below 1, the formula finds no single mRNA cells (because they already removed all non-zero expression values from the cell) and we would have 0 as the numerator in the $\mathbf{M}\mathbf{_i}$ fraction. This cannot work and we get NaN as result.

I think because TPMs have smaller values, the function might make more sense on then.

```
t_estimate <- census(matrix=mat_r, method="t_estimate", ncores=1)</pre>
## [1] "20 %"
  [1] "40 %"
## [1] "60 %"
## [1] "80 %"
## [1] "100 %"
summary(t_estimate)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
    0.9914 0.9967
                    0.9999
                             0.9999 1.0031
                                              1.0087
plot(density(t_estimate))
```

density.default(x = t_estimate)

