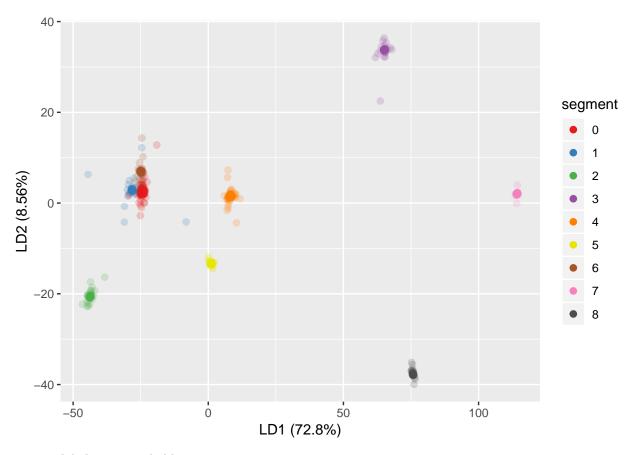
## LDA flu test

## LDA

```
https://tgmstat.wordpress.com/2014/01/15/computing-and-visualizing-lda-in-r/https://gist.github.com/
thigm85/8424654
library(MASS)
library(ggplot2)
library(scales)
cpal <- c('#e41a1c','#377eb8','#4daf4a','#984ea3','#ff7f00','#e6e600',</pre>
          '#a65628','#f781bf','#4d4d4d')
flu virus all test set 1
# label and seg data
uniflna_test1 <-
  read.csv("/home/brian/Documents/data_mining/flu_project/uniflna_test1.csv", na.strings="")
# comparisons from sourmash
uniflna_test1_cmp <-
  read.csv("/home/brian/Documents/data mining/flu project/uniflna test1 cmp.csv")
# Label the rows
rownames(uniflna_test1_cmp) <- colnames(uniflna_test1_cmp)</pre>
# add gene column
uniflna_test1_wgs <- uniflna_test1_cmp
uniflna_test1_wgs$gene <- uniflna_test1$gene
uniflna_test1_wgs$segment <- factor(uniflna_test1$segment)
# Transform for plotting
uniflna_test1_cmp_mat <- as.matrix(uniflna_test1_cmp)</pre>
lda <- lda(gene ~ .,
           {\tt uniflna\_test1\_wgs[,-1002])}
## Warning in lda.default(x, grouping, ...): variables are collinear
prop.lda = lda$svd^2/sum(lda$svd^2)
plda <- predict(object = lda,</pre>
                newdata = uniflna_test1_wgs)
dataset = data.frame(gene = uniflna_test1_wgs[,1001],
                      lda = plda$x)
p1 <- ggplot(dataset) + geom_point(aes(lda.LD1, lda.LD2, colour = gene), size=2, alpha=0.2) +
  #theme_minimal() +
  labs(x = paste("LD1 (", percent(prop.lda[1]), ")", sep=""),
       y = paste("LD2 (", percent(prop.lda[2]), ")", sep="")) +
  scale_color_manual(values=cpal) +
  guides(colour = guide_legend(override.aes = list(alpha = 1)))
```

# https://stackoverflow.com/questions/5290003/how-to-set-legend-alpha-with-ggplot2

```
\# ggsave("gene_LDA_plot.png", plot = p1, width = 7, height = 4, dpi = 200)
р1
    100 -
                                                                                    gene
     50 -
                                                                                        HA
                                                                                        M1
LD2 (21.9%)
                                                                                        NA
      0 -
                                                                                        NEP
                                                                                        NP
                                                                                        PA
                                                                                        PB1
    -50 -
                                                                                        PB2
                                                                                        uncl
   -100 -
                       Ö
                                                                    300
                                      100
                                                     200
      -100
                                      LD1 (69.8%)
lda2 <- lda(segment ~ .,</pre>
           uniflna_test1_wgs[,-1001])
## Warning in lda.default(x, grouping, ...): variables are collinear
prop.lda2 = lda2$svd^2/sum(lda2$svd^2)
plda2 <- predict(object = lda2,</pre>
                newdata = uniflna_test1_wgs)
segment labels
dataset2 = data.frame(segment = uniflna_test1_wgs[,1002],
                      1da2 = p1da2$x)
p2 <- ggplot(dataset2) + geom_point(aes(lda2.LD1, lda2.LD2, colour = segment), size=2, alpha=0.2) +
  #theme_minimal() +
  labs(x = paste("LD1 (", percent(prop.lda2[1]), ")", sep=""),
       y = paste("LD2 (", percent(prop.lda2[2]), ")", sep="")) +
  scale_color_manual(values=cpal) +
  guides(colour = guide_legend(override.aes = list(alpha = 1)))
p2
```



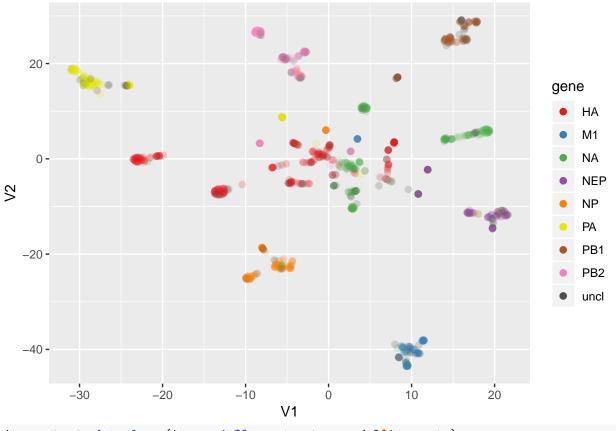
segment labels not as reliable.

## Tsne for fun

```
library(Rtsne)

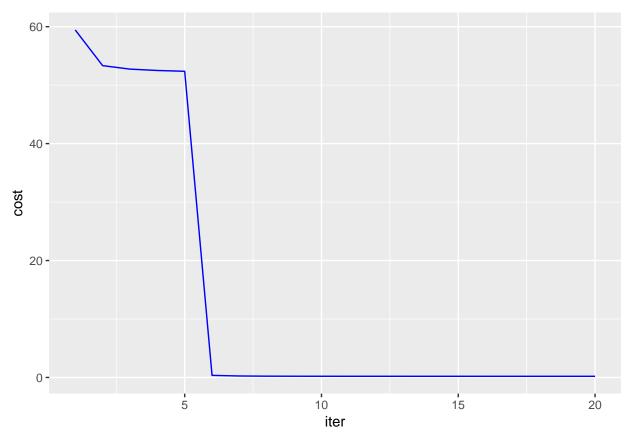
tsne_model <- Rtsne(uniflna_test1_cmp_mat, check_duplicates=FALSE, pca=TRUE, perplexity=50, theta=0.25,
d_tsne = as.data.frame(tsne_model$Y)
d_tsne$gene <- uniflna_test1_wgs[,1001]
#plot(d_tsne$V1, d_tsne$V2)

ggplot(d_tsne, aes(V1, V2, colour = gene)) + geom_point(size=2, alpha=0.2) +
    scale_color_manual(values=cpal) +
    guides(colour = guide_legend(override.aes = list(alpha = 1)))</pre>
```



itercosts <- data.frame(iter = 1:20, cost = tsne\_model\$itercosts)

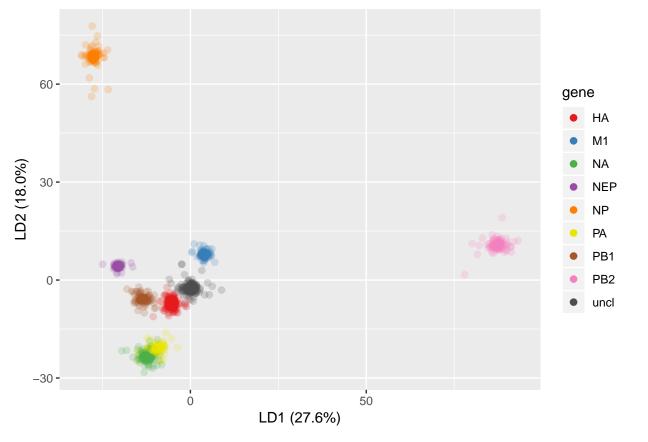
ggplot(itercosts, aes(iter,cost)) + geom\_line(color='blue')</pre>



second sample with 2500 sequences, k=7 uniflna\_test2\_cmp.csv

```
# label and seg data
uniflna_test2 <-
  read.csv("/home/brian/Documents/data_mining/flu_project/uniflna_test2.csv", na.strings="")
# comparisons from sourmash
uniflna_test2_cmp <-
  read.csv("/home/brian/Documents/data_mining/flu_project/uniflna_test2_cmp.csv")
# Label the rows
rownames(uniflna_test2_cmp) <- colnames(uniflna_test2_cmp)</pre>
# add gene column
uniflna_test2_wgs <- uniflna_test2_cmp</pre>
uniflna_test2_wgs$gene <- uniflna_test2$gene
uniflna_test2_wgs$type <- uniflna_test2$type
uniflna_test2_wgs$HNtype <- uniflna_test2$HNtype</pre>
#uniflna_test2_wgs$segment <- factor(uniflna_test1$segment)</pre>
# Transform for plotting
uniflna_test2_cmp_mat <- as.matrix(uniflna_test2_cmp)</pre>
lda3 <- lda(gene ~ .,
           uniflna_test2_wgs)
```

## Warning in lda.default(x, grouping, ...): variables are collinear



ABC type labels

## Warning in lda.default(x, grouping,  $\dots$ ): variables are collinear

```
prop.lda4 = lda4$svd^2/sum(lda4$svd^2)
plda4 <- predict(object = lda4,</pre>
                newdata = uniflna_test2_wgs)
dataset4 = data.frame(type = uniflna_test2_wgs[,2502],
                      1da4 = plda4$x)
p4 <- ggplot(dataset4) + geom_point(aes(lda4.LD1, lda4.LD2, colour = type), size=2, alpha=0.2) +
  #theme_minimal() +3
  labs(x = paste("LD1 (", percent(prop.lda4[1]), ")", sep=""),
       y = paste("LD2 (", percent(prop.lda4[2]), ")", sep="")) +
  scale_color_manual(values=cpal) +
  guides(colour = guide_legend(override.aes = list(alpha = 1)))
# https://stackoverflow.com/questions/5290003/how-to-set-legend-alpha-with-ggplot2
\#ggsave("ABCtype\_LDA\_plot.png", plot = p4, width = 7, height = 4, dpi = 200)
p4
   1200 -
    800 -
                                                                                    type
LD2 (10.2%)
                                                                                        unk
    400 -
      0 -
                                 100
                                              200
                                                          300
                     0
                                                                       400
       -100
                                      LD1 (87.8%)
table(uniflna_test2_wgs$type)
##
##
           В
                   unk
## 2191 295
                      9
HN type labels
```

```
lda5 <- lda(HNtype ~ .,</pre>
           uniflna_test2_wgs)
## Warning in lda.default(x, grouping, ...): variables are collinear
prop.lda5 = lda5$svd^2/sum(lda5$svd^2)
plda5 <- predict(object = lda5,</pre>
                newdata = uniflna_test2_wgs)
dataset5 = data.frame(HNtype = uniflna_test2_wgs[,2503],
                      1da5 = p1da5$x)
p5 <- ggplot(dataset5) + geom_point(aes(lda5.LD1, lda5.LD2, colour = HNtype), size=2, alpha=0.5) +
  #theme_minimal() +3
  labs(x = paste("LD1 (", percent(prop.lda5[1]), ")", sep=""),
       y = paste("LD2 (", percent(prop.lda5[2]), ")", sep="")) + theme(legend.position="none")
  #scale_color_manual(values=cpal) +
  #guides(colour = guide_legend(override.aes = list(alpha = 1)))
p5
     500 -
       0 -
LD2 (6.80%)
     –500 -
   -1000 -
   -1500 -
                                                                                1000
                  -1000
                                  -500
                                                                 500
                                             LD1 (8.61%)
table(uniflna_test2_wgs$HNtype)
##
##
      H1 H10N1 H10N2 H10N3 H10N4 H10N5 H10N6 H10N7 H10N8 H10N9 H11N1 H11N2
```

2

23

5

1

3

##

3

7

2

1

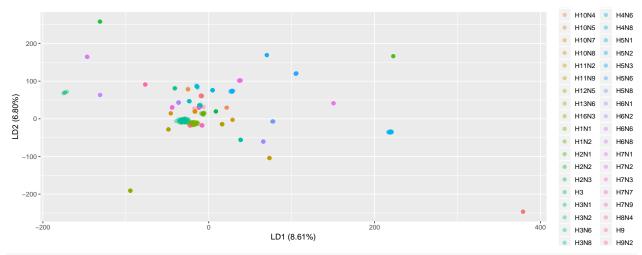
4

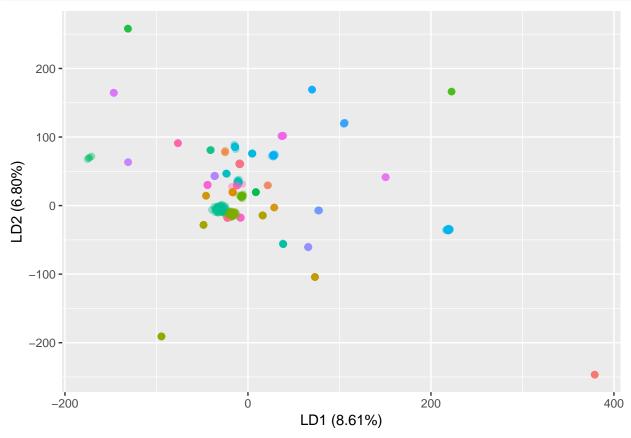
4

```
## H11N3 H11N8 H11N9 H12N2 H12N4 H12N5 H12N8 H12N9 H13N2 H13N6 H13N8 H13N9
##
                       9
                               1
                                            13
                                                     1
                                                                    3
                                                                          10
                                                                                   3
        2
                1
                                      1
                                                             1
                                          H<sub>1</sub>N<sub>4</sub>
                                                        H1N6
                                                                       H<sub>1</sub>N<sub>9</sub>
##
   H14N3 H15N9 H16N3
                           H1N1
                                  H<sub>1</sub>N<sub>2</sub>
                                                 H<sub>1</sub>N<sub>5</sub>
                                                                H<sub>1</sub>N<sub>8</sub>
                                                                               H2N1
                                                                                      H2N2
                                     90
##
        1
                2
                      11
                            572
                                             1
                                                     1
                                                            2
                                                                           1
##
    H2N3
            H2N4
                   H2N5
                           H2N8
                                  H2N9
                                            НЗ
                                                 H3N1
                                                         H3N2
                                                                H3N3
                                                                        H3N6
                                                                               H3N7
                                                                                       H3N8
##
        8
                               1
                                             4
                                                     5
                                                          628
                                                                          10
                                                                                         91
                1
                       1
                                                                    1
    H3N9
            H4N2
                   H4N3
                           H4N5
                                  H4N6
                                          H4N8
                                                 H4N9
                                                         H5N1
                                                                H5N2
                                                                       H5N3
                                                                               H5N5
                                                                                      H5N6
##
##
        1
                8
                       1
                              1
                                     33
                                            14
                                                     2
                                                          149
                                                                   59
                                                                           5
                                                                                   1
                                                                                         16
##
    H5N8
            H5N9
                      Н6
                           H6N1
                                  H6N2
                                          H6N5
                                                 H6N6
                                                         H6N8
                                                                H7N1
                                                                       H7N2
                                                                               H7N3
                                                                                      H7N4
                       3
                                                                                  20
##
       10
                3
                             14
                                     34
                                             3
                                                     5
                                                                    5
                                                                          21
                                                                                          1
##
    H7N5
            H7N6
                   H7N7
                           H7N8
                                  H7N9
                                          H8N4
                                                    Н9
                                                         H9N1
                                                                H9N2
                                                                       H9N5
                                                                               H9N9
                                                                                      none
                      17
                                     27
                                             8
                                                     8
                                                            2
                                                                   98
                                                                                        366
##
                               1
                                                                           1
                                                                                   1
ggplot(dataset5) + geom point(aes(lda5.LD1, lda5.LD2, colour = HNtype), size=2, alpha=0.5) +
  #theme minimal() +3
  labs(x = paste("LD1 (", percent(prop.lda5[1]), ")", sep=""),
        y = paste("LD2 (", percent(prop.lda5[2]), ")", sep=""))
                                                                             пицуро
                                                                                       H12N5
                                                                                              H2N1 • H4N5
                                                                                       H12N8
                                                                                              H2N2
                                                                                                     H4N6
                                                                                                           H7N2
                                                                               H10N1
   500
                                                                               H10N3
                                                                                       H13N2
                                                                                              H2N4
                                                                                                            H7N4
                                                                               H10N4
                                                                                       H13N6
                                                                                       H13N8
                                                                                              H2N8
                                                                                                           H7N7
                                                                               H10N6
                                                                                       H13N9
                                                                                              H2N9
                                                                                                     H5N3
   -500
                                                                               H10N8
                                                                                       H15N9
                                                                                              H3N1
                                                                                                     H5N6
                                                                                                           H7N9
                                                                               H10N9
                                                                                       H16N3
                                                                                              H3N2
                                                                                                     H5N8
                                                                               H11N1
                                                                                       H1N1
                                                                                              H3N3
                                                                                       H1N2
                                                                               H11N2
                                                                                              H3N6
                                                                                                     H6
                                                                                                           H9N1
  -1000
                                                                               H11N8
                                                                                       H1N5
                                                                                              H3N8
                                                                                                     H6N2
                                                                                                           H9N5
                                                                                       H1N6
                                                                                              H3N9
                                                                                                     H6N5
                                                                                       H1N8
                                                                                              H4N2
                                                                                                     H6N6
                                                                               H12N4
                                                                                       H1N9

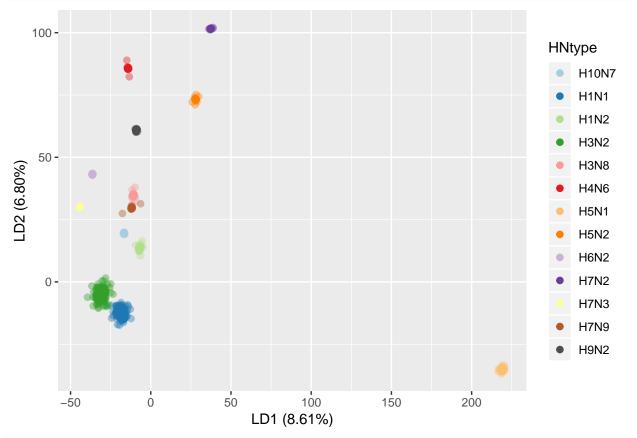
    H4N3

              -1000
                           -500
                                    ύ
LD1 (8.61%)
                                                    500
                                                                1000
library(dplyr)
##
## Attaching package: 'dplyr'
## The following object is masked from 'package:MASS':
##
##
        select
   The following objects are masked from 'package:stats':
##
##
##
        filter, lag
##
   The following objects are masked from 'package:base':
##
##
        intersect, setdiff, setequal, union
fds5 <- dataset5 %% group_by(HNtype) %% filter(n() > 3) %% filter(HNtype != 'none')
ggplot(fds5) + geom_point(aes(lda5.LD1, lda5.LD2, colour = HNtype), size=2, alpha=0.4) +
  #theme minimal() +
  labs(x = paste("LD1 (", percent(prop.lda5[1]), ")", sep=""),
        y = paste("LD2 (", percent(prop.lda5[2]), ")", sep=""))
```





```
#scale_color_manual(values=cpal) +
    #guides(colour = guide_legend(override.aes = list(alpha = 1)))
# https://stackoverflow.com/questions/5290003/how-to-set-legend-alpha-with-ggplot2
#ggsave("HNType_LDA_plot.png", width = 7, height = 4, dpi = 200)
```



# ggsave("HNType\_thirty\_LDA\_plot.png", width = 7, height = 4, dpi = 200)