Untitled Draft

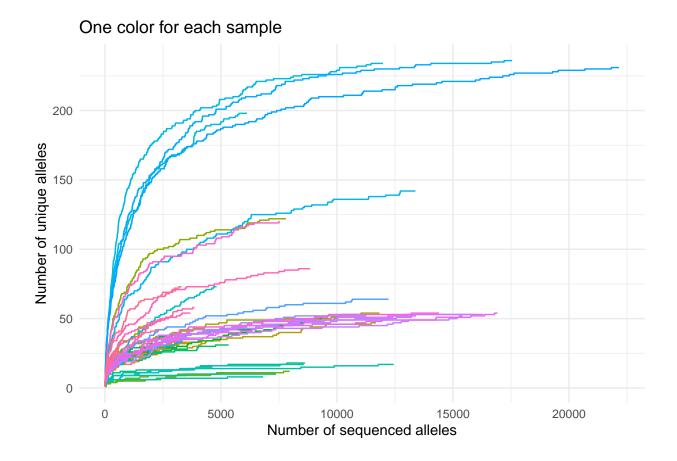
Report Author

01 October, 2020

Data

```
## # A tibble: 374,923 x 6
##
      sample
                   amplicon chr
                                    start readseq htype
##
      <chr>
                      <dbl> <chr>
                                    <dbl>
                                            <dbl> <chr>
   1 1_M.bscflags
                          1 chr1 3567622
##
                                                1 11111111
   2 1_M.bscflags
                          1 chr1
                                  3567622
                                                2 11111111
    3 1_M.bscflags
                                                3 11111111
                          1 chr1
                                  3567622
##
   4 1_M.bscflags
                          1 chr1
                                  3567622
                                                4 00111111
##
  5 1_M.bscflags
                          1 chr1
                                  3567622
                                                5 01111111
  6 1_M.bscflags
                          1 chr1
                                  3567622
                                                6 11111111
   7 1_M.bscflags
                          1 chr1
                                  3567622
                                                7 11111111
## 8 1_M.bscflags
                          1 chr1
                                  3567622
                                                8 11111111
## 9 1_M.bscflags
                          1 chr1
                                  3567622
                                                9 11111111
## 10 1_M.bscflags
                          1 chr1
                                  3567622
                                               10 11111111
## # ... with 374,913 more rows
```

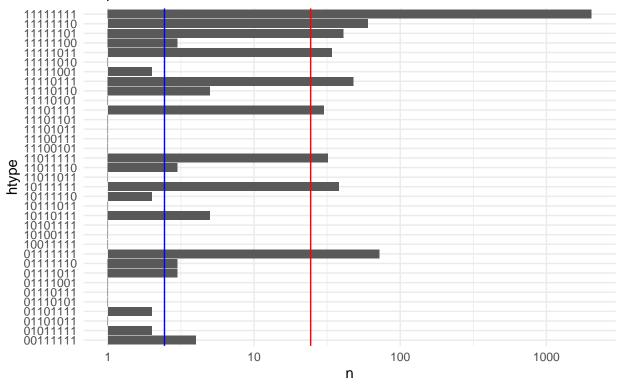
Number of unique reads by number of reads



Count of alleles in 1_M.bscflags sample

Notice that x-axis is on log-scale

Proportion: blue = 0.001, red = 0.01



Proportion 0.05

```
## # A tibble: 47 x 4
                     amplicon n_dist htype_length
      sample
##
      <chr>
                        <dbl> <int>
                                            <int>
##
   1 1_M.bscflags
                                                8
## 2 2_M.bscflags
                                                8
                            1
                                   1
  3 3_M.bscflags
                                                8
  4 33_BS.bscflags
                                                8
                                   3
  5 34_BS.bscflags
                                                8
  6 4_M.bscflags
                                   1
                                                8
##
## 7 5_M.bscflags
                                                8
## 8 6_M.bscflags
                                                8
                                   1
  9 60_M.bscflags
                                   2
                                                8
## 10 61_D.bscflags
                                                8
                                   3
## # ... with 37 more rows
```

Proportion 0.02

A tibble: 47 x 4

| ## | | sample | amplicon | n_{dist} | htype_length |
|----|-----|----------------|-------------|-------------|--------------|
| ## | | <chr></chr> | <dbl></dbl> | <int></int> | <int></int> |
| ## | 1 | 1_M.bscflags | 1 | 3 | 8 |
| ## | 2 | 2_M.bscflags | 1 | 3 | 8 |
| ## | 3 | 3_M.bscflags | 1 | 3 | 8 |
| ## | 4 | 33_BS.bscflags | 1 | 3 | 8 |
| ## | 5 | 34_BS.bscflags | 1 | 6 | 8 |
| ## | 6 | 4_M.bscflags | 1 | 4 | 8 |
| ## | 7 | 5_M.bscflags | 1 | 5 | 8 |
| ## | 8 | 6_M.bscflags | 1 | 5 | 8 |
| ## | 9 | 60_M.bscflags | 1 | 3 | 8 |
| ## | 10 | 61_D.bscflags | 1 | 5 | 8 |
| ## | # . | with 37 more | e rows | | |

Proportion 0.01

| ## | # / | A tibble: 47 x | 4 | | |
|----|-----|----------------|-------------|-------------|--------------|
| ## | | sample | amplicon | n_{dist} | htype_length |
| ## | | <chr></chr> | <dbl></dbl> | <int></int> | <int></int> |
| ## | 1 | 1_M.bscflags | 1 | 9 | 8 |
| ## | 2 | 2_M.bscflags | 1 | 9 | 8 |
| ## | 3 | 3_M.bscflags | 1 | 9 | 8 |
| ## | 4 | 33_BS.bscflags | 1 | 3 | 8 |
| ## | 5 | 34_BS.bscflags | 1 | 9 | 8 |
| ## | 6 | 4_M.bscflags | 1 | 9 | 8 |
| ## | 7 | 5_M.bscflags | 1 | 9 | 8 |
| ## | 8 | 6_M.bscflags | 1 | 9 | 8 |
| ## | 9 | 60_M.bscflags | 1 | 6 | 8 |
| ## | 10 | 61_D.bscflags | 1 | 9 | 8 |
| ## | # | with 37 more | e rows | | |

Proportion 0.001

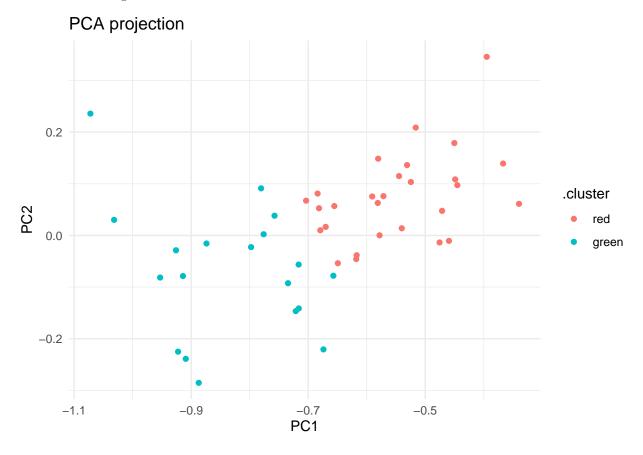
```
## # A tibble: 47 \times 4
                    amplicon n_dist htype_length
##
     sample
##
      <chr>
                       <dbl> <int>
                                       <int>
## 1 1_M.bscflags
                           1
                                 16
## 2 2_M.bscflags
                                               8
                           1
                                 13
## 3 3_M.bscflags
                           1
                                 13
                                               8
## 4 33_BS.bscflags
                                 3
## 5 34_BS.bscflags
                                 27
                                               8
                                               8
## 6 4_M.bscflags
                                 15
## 7 5_M.bscflags
                                 21
                                               8
## 8 6_M.bscflags
                                               8
                                 11
## 9 60_M.bscflags
                                 19
                                               8
## 10 61_D.bscflags
                                 28
## # ... with 37 more rows
```

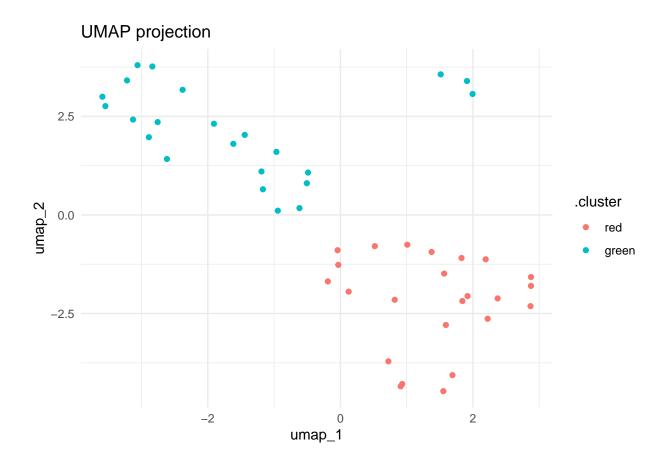
Clustering

We calculated the number of patterns that appears at least 1% of the times for each sample and amplicon. This gives us data on the following form:

```
# A tibble: 1,583 x 4
##
                      amplicon n_pattern htype_length
##
      sample
      <chr>
                          <dbl>
                                    <int>
                                                  <int>
##
##
    1 1_M.bscflags
                              1
                                                       8
    2 2_M.bscflags
                                                       8
##
                              1
                                         9
##
    3 3_M.bscflags
                              1
                                         9
                                                       8
    4 33_BS.bscflags
                                                       8
##
                              1
                                         3
##
    5 34_BS.bscflags
                              1
                                         9
                                                       8
                                                       8
    6 4_M.bscflags
                                         9
##
                              1
   7 5_M.bscflags
                              1
                                         9
                                                       8
##
##
   8 6 M.bscflags
                              1
                                         9
                                                       8
   9 60_M.bscflags
                                                       8
                              1
                                         6
## 10 61_D.bscflags
                                         9
                                                       8
## # ... with 1,573 more rows
```

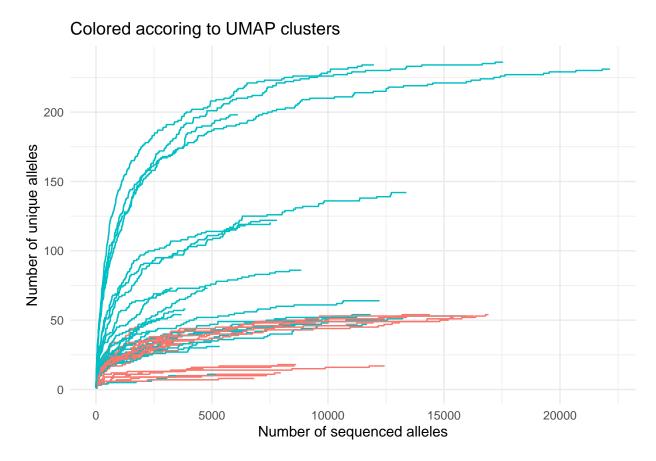
We then transform the data to have amplicons as columns and samples as rows. Do mean-imputation of missing values. Then we project the data down to a lower dimensional space and see if we can find cluster with an kmeans algorithm.



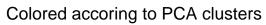


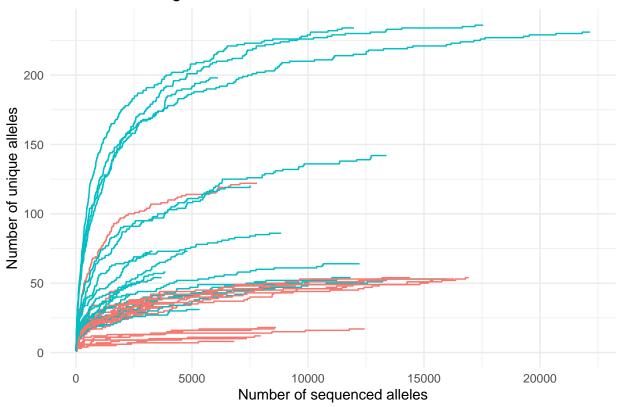
Clusters applied to first chart

We take the clusters we found in the UMAP project and color the first chart accordingly.



We take the clusters we found in the PCA project and color the first chart accordingly.





Clusters

```
## Joining, by = "sample"
## Joining, by = "sample"
```

| sample | $pca_cluster$ | $umap_cluster$ | Type | description |
|-----------------|----------------------|----------------------|-------------|-------------------------------|
| 1_M.bscflags | red | red | cell line | clonal passage18 subclone1 |
| 2 _M.bscflags | red | red | cell line | clonal passage18 subclone3 |
| 3 _M.bscflags | red | red | xenograph | clonal xenograph 4 months |
| 33_BS.bscflags | red | red | xenograph | polyclonal xenograph 4 months |
| 34_BS.bscflags | red | red | cell line | clonal passage24 subclone5 |
| 4_M.bscflags | red | red | cell line | clonal passage 70 subclone1 |
| 5_M.bscflags | red | red | cell line | clonal passage 70 subclone 3 |
| 6 _M.bscflags | red | red | colon crypt | NA |
| 62_D.bscflags | red | red | colon crypt | NA |
| 64_D.bscflags | red | red | si crypt | NA |
| 67_D.bscflags | red | red | colon crypt | NA |
| 7_M.bscflags | red | red | colon crypt | NA |
| 71_D.bscflags | red | red | colon crypt | NA |
| 72_D.bscflags | red | red | colon crypt | NA |
| 73_D.bscflags | red | red | colon crypt | NA |
| 74_D.bscflags | red | red | colon crypt | NA |
| 75_D.bscflags | red | red | bulk DNA | tumor J side A |

| sample | pca_cluster | umap_cluster | Type | description |
|------------------|----------------------|----------------------|-------------|------------------------------|
| 8_M.bscflags | red | red | bulk DNA | normal colon M |
| 86_D.bscflags | red | red | NA | NA |
| 87 D.bscflags | red | red | NA | NA |
| 88 D.bscflags | red | red | NA | NA |
| 89_D.bscflags | red | red | cell line | clonal passage 105 subclone3 |
| 9_M.bscflags | red | red | NA | NA |
| 90_D.bscflags | red | red | SURF | Tumor J |
| 60_M.bscflags | red | green | colon crypt | NA |
| 61_D.bscflags | green | green | colon crypt | NA |
| 63_D.bscflags | \overline{red} | green | si crypt | NA |
| 65_D.bscflags | red | green | si crypt | NA |
| 68_D.bscflags | green | green | colon crypt | NA |
| 69_D.bscflags | red | green | cell line | clonal passage 70 subclone5 |
| 70_D.bscflags | green | green | colon crypt | NA |
| 76_D.bscflags | green | green | bulk DNA | tumor J side B |
| 77_D.bscflags | green | green | bulk DNA | normal colon J |
| $78_D.bscflags$ | green | green | bulk DNA | tumor M side A |
| 79_D.bscflags | green | green | cell line | clonal passage 105 subclone1 |
| $80_D.bscflags$ | green | green | bulk DNA | normal colon D |
| $81_D.bscflags$ | green | green | xenograph | polyclonal |
| $82_D.bscflags$ | green | green | xenograph | clonal 4 months |
| $83_D.bscflags$ | green | green | xenograph | clonal 4 months |
| $84_D.bscflags$ | green | green | xenograph | clonal 4 months |
| $85_D.bscflags$ | green | green | NA | NA |
| $91_D.bscflags$ | green | green | NA | NA |
| $92_D.bscflags$ | green | green | NA | NA |
| $93_D.bscflags$ | green | green | SURF | Tumor J |
| $94_D.bscflags$ | green | green | SURF | Tumor J |
| $95_D.bscflags$ | green | green | SURF | Tumor J |
| 96_D.bscflags | green | green | cell line | clonal passage 105 subclone5 |

Reproducibility

Reproducibility receipt

```
## [1] "2020-10-01 12:59:50 PDT"
## R version 4.0.2 (2020-06-22)
## Platform: x86_64-apple-darwin17.0 (64-bit)
## Running under: macOS Mojave 10.14.6
##
## Matrix products: default
## BLAS: /Library/Frameworks/R.framework/Versions/4.0/Resources/lib/libRblas.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.0/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/c/en_US.UTF-8/en_US.UTF-8
## attached base packages:
## [1] stats
             graphics grDevices utils
                                              datasets methods
                                                                  base
##
```

```
## other attached packages:
##
   [1] drc 3.0-1
                             MASS_7.3-51.6
                                                 embed 0.1.1
    [4] recipes 0.1.13.9001 cpp11 0.2.1
                                                 readxl 1.3.1
                             stringr_1.4.0
                                                 dplyr_1.0.2
   [7] forcats_0.5.0
## [10] purrr_0.3.4
                             readr_1.3.1
                                                 tidyr_1.1.2
## [13] tibble 3.0.3
                             ggplot2_3.3.2
                                                 tidyverse 1.3.0
## [16] rmarkdown 2.3
                             drake 7.12.4
                                                 dotenv 1.0.2
## [19] conflicted_1.0.4
##
## loaded via a namespace (and not attached):
     [1] backports_1.1.9
                                 plyr_1.8.6
                                                         igraph_1.2.5
     [4] splines_4.0.2
                                 storr_1.2.1
##
                                                         crosstalk_1.1.0.1
##
     [7] tfruns_1.4
                                 TH.data_1.0-10
                                                         rstantools_2.1.1
##
   [10] inline_0.3.16
                                 digest_0.6.25
                                                         htmltools_0.5.0
                                 fansi_0.4.1
##
    [13] rsconnect_0.8.16
                                                         magrittr_1.5
##
    [16] memoise_1.1.0
                                 base64url_1.4
                                                         openxlsx_4.1.5
##
   [19] modelr_0.1.8
                                 gower_0.2.2
                                                         matrixStats_0.56.0
    [22] RcppParallel 5.0.2
                                 sandwich_2.5-1
                                                         xts 0.12.1
##
   [25] prettyunits_1.1.1
                                                         blob_1.2.1
                                 colorspace_1.4-1
##
    [28] rvest 0.3.6
                                 haven_2.3.1
                                                         xfun 0.17
##
   [31] callr_3.4.4
                                 crayon_1.3.4.9000
                                                         jsonlite_1.7.1
                                 zeallot_0.1.0
##
   [34] lme4 1.1-23
                                                         survival_3.2-3
    [37] zoo_1.8-8
##
                                 glue_1.4.2
                                                         gtable_0.3.0
                                                         car_3.0-9
##
    [40] ipred 0.9-9
                                 V8 3.2.0
                                                        abind_1.4-5
##
   [43] pkgbuild_1.1.0
                                 rstan_2.21.2
   [46] scales_1.1.1
                                 mvtnorm_1.1-1
                                                         decor 1.0.0
##
                                                         Rcpp_1.0.5
   [49] DBI_1.1.0
                                 miniUI_0.1.1.1
##
    [52] plotrix_3.7-8
                                 xtable_1.8-4
                                                         progress_1.2.2
##
   [55] reticulate_1.16
                                 foreign_0.8-80
                                                         txtq_0.2.3
   [58] StanHeaders_2.21.0-6
                                 stats4_4.0.2
                                                         lava_1.6.7
##
    [61] prodlim_2019.11.13
                                 DT_0.15
                                                         htmlwidgets_1.5.1.9002
##
   [64] httr_1.4.2
                                 threejs_0.3.3
                                                         ellipsis_0.3.1
##
   [67] farver_2.0.3
                                 100_2.3.1
                                                         pkgconfig_2.0.3
##
   [70] uwot_0.1.8
                                 nnet_7.3-14
                                                         dbplyr_1.4.4
##
    [73] utf8 1.1.4
                                 labeling_0.3
                                                         tidyselect_1.1.0
##
   [76] rlang_0.4.7
                                 reshape2_1.4.4
                                                         later_1.1.0.1
   [79] munsell 0.5.0
                                 cellranger 1.1.0
                                                         tools 4.0.2
##
   [82] cli_2.0.2
                                 generics_0.0.2
                                                         broom_0.7.0
                                                         fastmap_1.0.1
##
    [85] ggridges_0.5.2
                                 evaluate_0.14
##
                                 processx_3.4.4
                                                         knitr_1.29
  [88] yaml_2.2.1
  [91] fs_1.5.0
                                 zip_2.1.0
                                                         nlme 3.1-148
                                 mime_0.9
                                                         rstanarm_2.21.1
##
   [94] whisker 0.4
##
   [97] xml2 1.3.2
                                 brio 1.0.0
                                                         compiler 4.0.2
## [100] bayesplot_1.7.2
                                 shinythemes_1.1.2
                                                         rstudioapi_0.11
## [103] curl_4.3
                                 filelock_1.0.2
                                                         reprex_0.3.0
## [106] statmod_1.4.34
                                 stringi_1.5.3
                                                         highr_0.8
## [109] ps_1.3.4
                                 desc_1.2.0
                                                         lattice_0.20-41
## [112] Matrix_1.2-18
                                 tensorflow_2.2.0
                                                         keras_2.3.0.0
## [115] nloptr_1.2.2.2
                                 markdown_1.1
                                                         shinyjs_2.0.0
## [118] vctrs_0.3.4
                                 pillar_1.4.6
                                                         lifecycle_0.2.0
## [121] data.table_1.13.0
                                 httpuv_1.5.4
                                                         R6_2.4.1
## [124] promises_1.1.1
                                 rio 0.5.16
                                                         gridExtra 2.3
## [127] codetools_0.2-16
                                 boot_1.3-25
                                                         colourpicker_1.0
## [130] gtools 3.8.2
                                 assertthat 0.2.1
                                                         rprojroot 1.3-2
```

| ## | [133] | withr_2.2.0 | shinystan_2.5.0 | multcomp_1.4-13 |
|----|-------|----------------------------|-------------------|------------------|
| ## | [136] | parallel_4.0.2 | hms_0.5.3 | grid_4.0.2 |
| ## | [139] | rpart_4.1-15 | timeDate_3043.102 | class_7.3-17 |
| ## | [142] | minqa_1.2.4 | carData_3.0-4 | shiny_1.5.0 |
| ## | [145] | <pre>lubridate_1.7.9</pre> | base64enc 0.1-3 | dygraphs_1.1.1.6 |