## Final Project - Ruining Zhou

#### Ruining Zhou

#### 2025-08-05

#### Submission 1

# read the datasets

```
genes <- read.csv("~/Desktop/QBS 103/Homework/Final Project/QBS103_GSE157103_genes.csv", row.names = 1)</pre>
series.matrix <- read.csv("~/Desktop/QBS 103/Homework/Final Project/QBS103_GSE157103_series_matrix-1.cs</pre>
# identify one gene, one continuous covariate, and two categorical covariates in the provided dataset.
# choose gene "AATF"
genes["AATF",]
##
        COVID_01_39y_male_NonICU COVID_02_63y_male_NonICU COVID_03_33y_male_NonICU
## AATF
                           45.83
                                                     39.37
                                                                               42.35
##
        COVID_04_49y_male_NonICU COVID_05_49y_male_NonICU COVID_06_.y_male_NonICU
## AATF
                                                     30.56
        COVID_07_38y_female_NonICU COVID_08_78y_male_ICU COVID_09_64y_female_ICU
##
  AATF
                              44.16
                                                    31.81
        COVID_10_62y_male_ICU COVID_11_52y_female_NonICU COVID_12_50y_male_ICU
##
##
  AATF
                                                    45.66
        COVID_13_37y_male_NonICU COVID_14_55y_male_ICU COVID_15_68y_male_ICU
##
## AATF
        COVID_16_48y_male_NonICU COVID_17_54y_male_NonICU
##
## AATF
                           45.35
        COVID_18_70y_female_NonICU COVID_19_51y_male_NonICU COVID_20_62y_male_ICU
##
## AATF
                               36.5
                                                                              46.16
        COVID_21_66y_male_ICU COVID_22_43y_male_ICU COVID_23_76y_male_ICU
##
## AATF
                        33.95
                                               26.37
                                                                      34.65
##
        COVID_24_55y_male_ICU COVID_25_55y_male_ICU COVID_26_41y_female_ICU
## AATF
                        35.23
                                               39.65
        COVID_27_71y_female_ICU COVID_28_63y_male_ICU COVID_29_63y_female_ICU
##
## AATF
                           33.25
                                                 38.01
##
        COVID_30_54y_male_ICU COVID_31_50y_male_ICU COVID_32_72y_male_ICU
  AATF
##
                        34.05
        COVID_33_81y_male_NonICU COVID_34_64y_female_NonICU
## AATF
                           40.75
        COVID_35_58y_female_NonICU COVID_36_68y_male_NonICU
## AATF
                             35.31
##
        COVID_37_87y_male_NonICU COVID_38_68y_male_ICU COVID_39_80y_female_ICU
## AATF
                                                  28.34
        COVID_40_66y_male_ICU COVID_41_74y_male_ICU COVID_42_21y_female_ICU
## AATF
                                               29.56
                        37.86
                                                                        39.06
```

```
##
        COVID_43_83y_female_ICU COVID_44_46y_male_ICU COVID_45_62y_female_ICU
## AATF
                          23.57
                                                 37.64
                                                                         32.54
        COVID_46_62y_male_ICU COVID_47_78y_male_ICU COVID_48_72y_female_ICU
##
##
  AATF
                        35.15
                                              52.61
##
        COVID_49_73y_male_ICU COVID_50_37y_male_ICU COVID_51_58y_female_NonICU
##
  AATF
                        40.75
        COVID_52_71y_male_NonICU COVID_53_35y_female_NonICU
##
## AATF
                            43.6
##
        COVID_55_62y_female_ICU COVID_56_33y_female_NonICU
  AATF
##
                          42.51
        COVID_57_30y_female_NonICU COVID_58_62y_male_NonICU
   AATF
##
                             49.31
        COVID_59_55y_male_NonICU COVID_60_49y_male_NonICU
##
  AATF
                           45.74
##
        COVID_61_54y_female_NonICU COVID_62_78y_female_ICU COVID_63_39y_female_ICU
## AATF
                             45.81
                                                      32.03
                                                                              47.55
##
        COVID_64_65y_male_ICU COVID_65_84y_male_NonICU COVID_66_66y_female_NonICU
  AATF
                        36.76
                                                 45.17
        COVID_67_57y_male_ICU COVID_68_79y_male_ICU COVID_69_77y_female_NonICU
##
##
  AATF
                        29.55
                                             26.27
##
        COVID_70_81y_male_NonICU COVID_71_37y_male_ICU COVID_72_50y_female_NonICU
  AATF
                                                 30.91
        COVID_73_82y_male_NonICU COVID_74_55y_female_ICU COVID_75_55y_male_NonICU
##
## AATF
                                                    24.46
                           55.87
##
        COVID_76_73y_female_ICU COVID_77_55y_female_ICU COVID_78_80y_male_NonICU
  AATF
                          24.91
                                                  32.72
##
        COVID_79_27y_male_NonICU COVID_80_71y_male_ICU COVID_82_67y_male_NonICU
##
   AATF
                           45.85
        COVID_83_85y_female_NonICU COVID_84_75y_female_NonICU
##
  AATF
                             35.35
        COVID_85_62y_male_ICU COVID_86_52y_female_NonICU COVID_87_61y_male_ICU
##
## AATF
                        23.24
                                                     38.6
        COVID_89_90y_female_NonICU COVID_90_86y_female_NonICU
##
  AATF
##
                             29.41
        COVID_91_29y_female_NonICU COVID_92_82y_female_ICU COVID_93_81y_female_ICU
##
##
  AATF
                                                     22.38
                             31.21
##
        COVID_94_24y_female_NonICU COVID_95_49y_male_NonICU
## AATF
                             43.17
        COVID_96_51y_male_NonICU COVID_97_76y_male_ICU COVID_98_81y_male_NonICU
##
##
  AATF
                           27.71
                                                 31.65
        COVID_99_71y_male_ICU COVID_100_74y_female_NonICU COVID_101_58y_male_ICU
##
  AATF
                        36.85
        COVID_102_84y_male_NonICU COVID_103_83y_male_NonICU
                            33.19
##
  AATF
        NONCOVID_01_54y_female_NonICU NONCOVID_02_65y_male_ICU
## AATF
                                37.33
        NONCOVID_03_65y_male_ICU NONCOVID_04_90y_male_NonICU
##
## AATF
                           28.33
       NONCOVID_05_83y_female_NonICU NONCOVID_06_75y_female_ICU
##
  AATF
                                 32.3
##
        NONCOVID_07_50y_male_ICU NONCOVID_08_53y_female_ICU
## AATF
                           40.42
       NONCOVID_09_49y_female_NonICU NONCOVID_10_67y_male_ICU
## AATF
                                42.64
                                                           27.9
```

```
NONCOVID_11_58y_female_NonICU NONCOVID_12_82y_male_ICU
##
## AATF
                                                          36.86
                                43.38
        NONCOVID_13_65y_male_ICU NONCOVID_14_75y_female_ICU
##
## AATF
                           34.24
        NONCOVID_15_83y_unknown_ICU NONCOVID_16_40y_female_ICU
##
## AATF
                              49.21
        NONCOVID_17_84y_female_ICU NONCOVID_18_88y_male_ICU
##
                             42.71
## AATF
        NONCOVID_19_66y_female_ICU NONCOVID_20_62y_female_ICU
##
## AATF
                             27.21
                                                         39.19
        NONCOVID_21_71y_male_NonICU NONCOVID_22_63y_male_NonICU
## AATF
                              44.55
##
        NONCOVID_23_42y_female_NonICU NONCOVID_24_32y_female_NonICU
                                37.58
                                                               50.13
## AATF
##
        NONCOVID_25_62y_male_NonICU NONCOVID_26_36y_male_ICU
## AATF
                              27.51
                                                        18.31
```

# check data set about to choose continuous covariate and categorical covariates head(genes)

##		COVID_01_39y_male_NonICU COVID_02_63y_male_NonIC	U
##	A1BG	0.49 0.2	9
##	A1CF	0.00	0
##	A2M	0.21 0.1	4
##	A2ML1	0.04 0.0	0
##	A3GALT2	0.07	0
##	A4GALT	0.00	0
##		COVID_03_33y_male_NonICU COVID_04_49y_male_NonIC	U
##	A1BG	0.26 0.4	5
##	A1CF	0.00 0.0	1
##	A2M	0.03	9
##	A2ML1	0.02 0.0	7
##	A3GALT2	0.00	0
##	A4GALT	0.00	0
##		COVID_05_49y_male_NonICU COVID_06y_male_NonICU	
##	A1BG	0.17 0.21	
##	A1CF	0.00 0.00	
##	A2M	0.00 0.08	
##	A2ML1	0.05 0.04	
##	A3GALT2	0.07 0.00	
##	A4GALT	0.00 0.00	
##		COVID_07_38y_female_NonICU COVID_08_78y_male_ICU	
##	A1BG	0.49 0.12	
##	A1CF	0.01 0.00	
##	A2M	0.23 0.08	
##	A2ML1	0.03 0.01	
##	A3GALT2	0.07 0.00	
##	A4GALT	0.00 0.00	
##		COVID_09_64y_female_ICU COVID_10_62y_male_ICU	
##	A1BG	0.51 0.10	
##	A1CF	0.01 0.00	
##	A2M	0.88 0.13	
##	A2ML1	0.02 0.01	
##	A3GALT2	0.79 0.15	

```
## A4GALT
                                0.00
                                                        0.00
##
           COVID_11_52y_female_NonICU COVID_12_50y_male_ICU
## A1BG
                                   0.38
## A1CF
                                   0.02
                                                           0.00
## A2M
                                   0.47
                                                           0.16
## A2ML1
                                   0.03
                                                           0.00
## A3GALT2
                                   0.08
                                                           1.75
## A4GALT
                                   0.00
                                                           0.00
##
           COVID_13_37y_male_NonICU COVID_14_55y_male_ICU COVID_15_68y_male_ICU
## A1BG
                                 0.18
                                                         0.23
                                                                                0.42
## A1CF
                                 0.00
                                                         0.00
                                                                                0.00
## A2M
                                                                                0.07
                                 0.07
                                                         0.22
## A2ML1
                                 0.01
                                                         0.04
                                                                                0.00
## A3GALT2
                                 0.00
                                                         0.93
                                                                                0.15
## A4GALT
                                 0.00
                                                         0.00
                                                                                0.03
##
           COVID_16_48y_male_NonICU COVID_17_54y_male_NonICU
## A1BG
                                 0.41
                                                            0.63
## A1CF
                                 0.01
                                                            0.02
## A2M
                                 0.58
                                                            0.15
## A2ML1
                                 0.00
                                                            0.02
## A3GALT2
                                 0.19
                                                            0.00
## A4GALT
                                 0.00
##
           COVID_18_70y_female_NonICU COVID_19_51y_male_NonICU
## A1BG
                                   0.47
                                                              0.33
## A1CF
                                   0.00
                                                              0.02
## A2M
                                   0.30
                                                              0.11
## A2ML1
                                   0.02
                                                              0.02
## A3GALT2
                                   0.06
                                                              0.00
## A4GALT
                                   0.03
                                                              0.00
           COVID_20_62y_male_ICU COVID_21_66y_male_ICU COVID_22_43y_male_ICU
##
## A1BG
                              0.32
                                                     0.18
                                                                             0.09
## A1CF
                              0.00
                                                     0.00
                                                                             0.00
## A2M
                              0.07
                                                     0.00
                                                                             0.06
## A2ML1
                              0.00
                                                     0.00
                                                                             0.00
## A3GALT2
                              0.22
                                                     0.37
                                                                             0.06
## A4GALT
                              0.00
                                                                             0.00
                                                     0.03
##
           COVID_23_76y_male_ICU COVID_24_55y_male_ICU COVID_25_55y_male_ICU
## A1BG
                              0.18
                                                     0.22
                                                                             0.29
## A1CF
                              0.01
                                                     0.01
                                                                             0.00
## A2M
                              0.03
                                                     0.11
                                                                             0.09
## A2ML1
                              0.00
                                                                             0.03
                                                     0.02
## A3GALT2
                              0.07
                                                     0.15
                                                                             0.00
## A4GALT
                              0.03
                                                     0.00
                                                                             0.00
##
           COVID_26_41y_female_ICU COVID_27_71y_female_ICU COVID_28_63y_male_ICU
## A1BG
                                0.42
                                                          0.16
                                                                                  0.18
## A1CF
                                0.00
                                                                                  0.00
                                                          0.01
## A2M
                                0.18
                                                          0.23
                                                                                  0.18
## A2ML1
                                0.00
                                                          0.01
                                                                                  0.05
## A3GALT2
                                0.87
                                                          0.18
                                                                                  0.45
## A4GALT
                                0.00
                                                          0.00
                                                                                  0.00
##
           COVID_29_63y_female_ICU COVID_30_54y_male_ICU COVID_31_50y_male_ICU
## A1BG
                                0.35
                                                        0.23
                                                                               0.15
## A1CF
                                0.00
                                                        0.00
                                                                               0.00
## A2M
                                0.03
                                                        0.11
                                                                               0.47
```

```
## A2ML1
                                                                               0.00
                                0.03
                                                       0.01
## A3GALT2
                                0.15
                                                       0.00
                                                                               0.00
                                0.03
## A4GALT
                                                       0.00
                                                                               0.03
##
           COVID_32_72y_male_ICU COVID_33_81y_male_NonICU
## A1BG
                              0.34
## A1CF
                              0.01
                                                        0.00
## A2M
                              0.04
                                                        0.30
## A2ML1
                              0.00
                                                        0.06
## A3GALT2
                              0.29
                                                        0.26
## A4GALT
                              0.00
                                                        0.00
           COVID_34_64y_female_NonICU COVID_35_58y_female_NonICU
## A1BG
                                   0.36
                                                                0.26
## A1CF
                                   0.00
                                                                0.00
## A2M
                                                                0.51
                                   0.11
## A2ML1
                                   0.00
                                                                0.02
## A3GALT2
                                   0.12
                                                                0.16
## A4GALT
                                   0.00
                                                                0.00
           COVID_36_68y_male_NonICU COVID_37_87y_male_NonICU COVID_38_68y_male_ICU
##
## A1BG
                                 0.18
                                                                                   0.29
                                                            0.20
                                 0.01
                                                            0.00
## A1CF
                                                                                   0.00
## A2M
                                 0.09
                                                            0.09
                                                                                   0.10
## A2ML1
                                 0.00
                                                            0.07
                                                                                   0.02
## A3GALT2
                                 0.08
                                                            0.31
                                                                                   0.35
## A4GALT
                                 0.00
                                                            0.00
##
           COVID_39_80y_female_ICU COVID_40_66y_male_ICU COVID_41_74y_male_ICU
## A1BG
                                0.19
                                                       0.22
                                                                               0.19
## A1CF
                                0.00
                                                       0.00
                                                                               0.00
## A2M
                                0.27
                                                       0.17
                                                                               0.14
## A2ML1
                                                       0.00
                                0.00
                                                                               0.00
## A3GALT2
                                0.00
                                                       0.08
                                                                               0.19
## A4GALT
                                0.07
                                                       0.00
                                                                               0.00
##
           COVID_42_21y_female_ICU COVID_43_83y_female_ICU COVID_44_46y_male_ICU
## A1BG
                                0.24
                                                          0.29
                                                                                 0.22
## A1CF
                                0.01
                                                          0.00
                                                                                 0.00
## A2M
                                0.33
                                                          0.00
                                                                                 0.14
## A2ML1
                                0.01
                                                          0.00
                                                                                 0.00
## A3GALT2
                                0.39
                                                          0.11
                                                                                 0.00
## A4GALT
                                0.00
                                                          0.00
                                                                                 0.04
           COVID_45_62y_female_ICU COVID_46_62y_male_ICU COVID_47_78y_male_ICU
##
                                                       0.53
## A1BG
                                0.14
                                                                               0.08
## A1CF
                                0.00
                                                       0.01
                                                                               0.01
## A2M
                                0.15
                                                       0.10
                                                                               0.04
## A2ML1
                                0.03
                                                       0.00
                                                                               0.03
## A3GALT2
                                                       0.06
                                0.19
                                                                               0.60
## A4GALT
                                                       0.00
                                0.00
##
           COVID_48_72y_female_ICU COVID_49_73y_male_ICU COVID_50_37y_male_ICU
                                                       0.48
## A1BG
                                0.19
                                                                               0.08
## A1CF
                                0.00
                                                       0.00
                                                                               0.00
## A2M
                                0.06
                                                       0.09
                                                                               0.01
## A2ML1
                                0.01
                                                       0.03
                                                                               0.00
## A3GALT2
                                0.23
                                                       0.00
                                                                               0.00
## A4GALT
                                0.06
                                                       0.00
                                                                               0.72
##
           COVID_51_58y_female_NonICU COVID_52_71y_male_NonICU
## A1BG
                                   0.21
```

```
0.01
## A1CF
                                   0.00
## A2M
                                   0.13
                                                              0.00
## A2ML1
                                   0.00
                                                              0.03
## A3GALT2
                                   0.00
                                                              0.00
## A4GALT
                                   0.00
                                                              0.00
##
           COVID_53_35y_female_NonICU COVID_55_62y_female_ICU
## A1BG
## A1CF
                                                            0.00
                                   0.00
## A2M
                                   0.64
                                                            0.09
## A2ML1
                                   0.10
                                                            0.01
## A3GALT2
                                   0.00
                                                            0.00
## A4GALT
                                   0.00
                                                            0.00
           COVID_56_33y_female_NonICU COVID_57_30y_female_NonICU
## A1BG
                                   0.28
                                                                0.42
## A1CF
                                   0.00
                                                                0.00
## A2M
                                   0.16
                                                                0.27
## A2ML1
                                   0.09
                                                                0.01
## A3GALT2
                                   0.23
                                                                0.19
## A4GALT
                                   0.00
                                                                0.05
##
           COVID_58_62y_male_NonICU COVID_59_55y_male_NonICU
## A1BG
                                 0.39
                                                           0.33
## A1CF
                                 0.00
                                                           0.00
## A2M
                                 0.08
                                                           0.10
## A2ML1
                                 0.00
                                                            0.00
## A3GALT2
                                 0.00
                                                           0.07
## A4GALT
                                 0.00
##
           COVID_60_49y_male_NonICU COVID_61_54y_female_NonICU
## A1BG
                                 0.22
                                                              0.25
## A1CF
                                 0.00
                                                              0.00
## A2M
                                 0.14
                                                              0.10
## A2ML1
                                 0.00
                                                              0.03
## A3GALT2
                                 0.00
                                                              0.13
## A4GALT
                                 0.02
                                                              0.00
##
           COVID_62_78y_female_ICU COVID_63_39y_female_ICU COVID_64_65y_male_ICU
## A1BG
                                0.21
                                                         0.29
                                                                                 0.38
## A1CF
                                0.00
                                                         0.00
                                                                                 0.01
## A2M
                                0.04
                                                         0.01
                                                                                 0.04
## A2ML1
                                0.00
                                                         0.00
                                                                                 0.02
## A3GALT2
                                0.05
                                                         0.14
                                                                                 0.56
## A4GALT
                                0.00
                                                         0.00
                                                                                 0.00
           COVID_65_84y_male_NonICU COVID_66_66y_female_NonICU
## A1BG
                                 0.40
                                                              0.64
## A1CF
                                 0.01
                                                              0.00
## A2M
                                 0.07
                                                              0.00
## A2ML1
                                 0.00
                                                              0.00
## A3GALT2
                                 0.58
                                                              0.00
## A4GALT
                                                              0.00
                                 0.00
##
           COVID_67_57y_male_ICU COVID_68_79y_male_ICU COVID_69_77y_female_NonICU
## A1BG
                              0.37
                                                     0.58
                                                                                  0.52
## A1CF
                              0.00
                                                     0.00
                                                                                  0.00
## A2M
                              0.35
                                                     0.15
                                                                                  0.29
## A2ML1
                              0.00
                                                     0.01
                                                                                  0.02
## A3GALT2
                             0.00
                                                     0.00
                                                                                  0.00
## A4GALT
                              0.00
                                                     0.05
                                                                                  0.00
```

```
COVID_70_81y_male_NonICU COVID_71_37y_male_ICU
## A1BG
                                                        0.07
                                 0.27
                                                        0.01
## A1CF
                                 0.00
## A2M
                                 0.07
                                                        0.12
## A2ML1
                                 0.00
                                                        0.01
## A3GALT2
                                 0.00
                                                        0.00
## A4GALT
                                 0.06
           COVID_72_50y_female_NonICU COVID_73_82y_male_NonICU
##
## A1BG
                                   0.52
## A1CF
                                   0.00
                                                             0.01
## A2M
                                   0.10
                                                              0.02
## A2ML1
                                   0.01
                                                              0.02
## A3GALT2
                                   0.00
                                                              0.17
## A4GALT
                                   0.00
                                                              0.04
##
           COVID_74_55y_female_ICU COVID_75_55y_male_NonICU
## A1BG
                                0.24
## A1CF
                                0.00
                                                          0.01
## A2M
                                0.12
                                                          0.14
## A2ML1
                                0.02
                                                          0.00
## A3GALT2
                                0.26
                                                          0.00
## A4GALT
                                0.00
                                                          0.00
##
           COVID_76_73y_female_ICU COVID_77_55y_female_ICU
## A1BG
                                0.17
                                                         0.05
## A1CF
                                0.00
                                                         0.00
## A2M
                                0.09
                                                         0.01
## A2ML1
                                0.01
                                                         0.00
## A3GALT2
                                0.04
                                                         0.00
## A4GALT
                                0.00
                                                         0.00
##
           COVID_78_80y_male_NonICU COVID_79_27y_male_NonICU COVID_80_71y_male_ICU
## A1BG
                                 0.19
                                                           0.08
                                                                                   0.28
## A1CF
                                 0.00
                                                           0.01
                                                                                   0.00
## A2M
                                 0.20
                                                           0.03
                                                                                   0.05
## A2ML1
                                 0.00
                                                           0.00
                                                                                   0.00
## A3GALT2
                                 0.00
                                                           0.00
                                                                                   0.05
## A4GALT
                                 0.00
                                                           0.00
                                                                                   0.00
           COVID_82_67y_male_NonICU COVID_83_85y_female_NonICU
## A1BG
                                 0.39
## A1CF
                                 0.01
                                                             0.00
## A2M
                                 0.10
                                                             0.18
## A2ML1
                                 0.00
                                                             0.05
## A3GALT2
                                 0.00
                                                             0.00
## A4GALT
                                 0.00
           COVID_84_75y_female_NonICU COVID_85_62y_male_ICU
## A1BG
                                   0.35
                                                          0.29
## A1CF
                                   0.00
                                                          0.00
## A2M
                                   0.03
                                                          0.04
## A2ML1
                                   0.00
                                                          0.00
## A3GALT2
                                   0.17
                                                          0.00
## A4GALT
                                   0.00
                                                          0.00
           COVID_86_52y_female_NonICU COVID_87_61y_male_ICU
## A1BG
                                   0.60
                                                          0.65
## A1CF
                                   0.00
                                                          0.00
## A2M
                                   0.27
                                                          0.15
## A2ML1
                                   0.02
                                                          0.00
```

```
## A3GALT2
                                   0.00
                                                          0.00
## A4GALT
                                   0.00
                                                          0.00
##
           COVID_89_90y_female_NonICU COVID_90_86y_female_NonICU
## A1BG
                                   0.20
## A1CF
                                   0.00
                                                                0.00
## A2M
                                   0.07
                                                                0.05
## A2ML1
                                   0.03
                                                                0.01
## A3GALT2
                                                                0.31
                                   0.14
## A4GALT
                                   0.00
                                                                0.02
##
           COVID_91_29y_female_NonICU COVID_92_82y_female_ICU
## A1BG
                                   0.60
## A1CF
                                   0.00
                                                            0.00
## A2M
                                   0.03
                                                            0.02
## A2ML1
                                                            0.04
                                   0.02
## A3GALT2
                                   0.05
                                                            0.58
## A4GALT
                                   0.00
                                                            0.00
##
           COVID_93_81y_female_ICU COVID_94_24y_female_NonICU
## A1BG
                                0.37
## A1CF
                                0.00
                                                            0.00
## A2M
                                0.11
                                                            0.17
## A2ML1
                                0.00
                                                            0.02
## A3GALT2
                                0.05
                                                            0.00
## A4GALT
                                0.00
                                                            0.06
##
           COVID_95_49y_male_NonICU COVID_96_51y_male_NonICU COVID_97_76y_male_ICU
## A1BG
                                0.37
                                                           1.61
                                                                                   0.19
## A1CF
                                 0.01
                                                           0.00
                                                                                   0.00
## A2M
                                 0.20
                                                           0.02
                                                                                   0.02
## A2ML1
                                 0.02
                                                           0.00
                                                                                   0.05
## A3GALT2
                                 0.15
                                                           0.00
                                                                                   0.12
## A4GALT
                                 0.00
                                                           0.00
                                                                                   0.03
##
           COVID_98_81y_male_NonICU COVID_99_71y_male_ICU
## A1BG
                                 0.78
                                                        0.33
## A1CF
                                 0.00
                                                        0.00
## A2M
                                 0.26
                                                        0.02
## A2ML1
                                 0.00
                                                        0.00
## A3GALT2
                                 0.37
                                                        0.04
## A4GALT
                                 0.00
                                                        0.00
##
           COVID_100_74y_female_NonICU COVID_101_58y_male_ICU
## A1BG
                                    0.30
                                                            0.33
## A1CF
                                    0.00
                                                            0.00
## A2M
                                    0.09
                                                            0.11
## A2ML1
                                    0.00
                                                            0.03
## A3GALT2
                                    0.04
                                                            0.05
## A4GALT
                                    0.00
                                                            0.00
           COVID_102_84y_male_NonICU COVID_103_83y_male_NonICU
## A1BG
                                  0.12
                                                             0.20
## A1CF
                                  0.00
                                                             0.00
## A2M
                                  0.01
                                                             0.03
## A2ML1
                                  0.01
                                                              0.03
## A3GALT2
                                  0.00
                                                              0.04
## A4GALT
                                  0.07
                                                             0.00
           NONCOVID_01_54y_female_NonICU NONCOVID_02_65y_male_ICU
##
## A1BG
                                      0.89
                                                                0.32
                                      0.00
## A1CF
                                                                0.00
```

```
## A2M
                                      0.04
                                                                 0.01
## A2ML1
                                      0.00
                                                                 0.00
## A3GALT2
                                      0.00
                                                                 0.04
## A4GALT
                                      0.00
                                                                0.00
           NONCOVID_03_65y_male_ICU NONCOVID_04_90y_male_NonICU
## A1BG
                                0.44
## A1CF
                                 0.00
                                                              0.00
## A2M
                                 0.05
                                                              0.05
## A2ML1
                                 0.02
                                                              0.00
## A3GALT2
                                 0.04
                                                              0.21
## A4GALT
                                 0.00
                                                              0.00
##
           NONCOVID_05_83y_female_NonICU NONCOVID_06_75y_female_ICU
## A1BG
                                      0.31
                                      0.00
## A1CF
                                                                   0.00
## A2M
                                      0.01
                                                                   0.14
## A2ML1
                                      0.01
                                                                   0.01
## A3GALT2
                                                                   0.00
                                      0.00
## A4GALT
                                      0.00
                                                                   0.06
##
           NONCOVID_07_50y_male_ICU NONCOVID_08_53y_female_ICU
## A1BG
                                 0.45
## A1CF
                                0.00
                                                             0.01
## A2M
                                 0.07
                                                             0.04
## A2ML1
                                 0.02
                                                             0.00
## A3GALT2
                                 0.00
                                                             0.15
## A4GALT
                                 0.00
                                                             0.00
           NONCOVID_09_49y_female_NonICU NONCOVID_10_67y_male_ICU
## A1BG
                                      0.40
## A1CF
                                      0.00
                                                                0.00
                                      0.04
## A2M
                                                                0.05
## A2ML1
                                      0.00
                                                                0.01
## A3GALT2
                                      0.00
                                                                0.23
## A4GALT
                                      0.00
                                                                 0.08
           NONCOVID_11_58y_female_NonICU NONCOVID_12_82y_male_ICU
##
                                      0.58
## A1BG
                                                                 0.12
## A1CF
                                      0.00
                                                                 0.00
## A2M
                                      0.03
                                                                0.02
## A2ML1
                                      0.00
                                                                 0.00
## A3GALT2
                                      0.00
                                                                0.00
## A4GALT
                                      0.00
           NONCOVID_13_65y_male_ICU NONCOVID_14_75y_female_ICU
##
## A1BG
                                 0.31
## A1CF
                                 0.00
                                                             0.00
## A2M
                                 0.04
                                                             0.08
## A2ML1
                                 0.01
                                                             0.00
## A3GALT2
                                 0.32
                                                             0.05
## A4GALT
                                 0.02
           NONCOVID_15_83y_unknown_ICU NONCOVID_16_40y_female_ICU
                                    0.59
## A1BG
## A1CF
                                    0.00
                                                                0.00
## A2M
                                    0.03
                                                                 0.07
## A2ML1
                                    0.04
                                                                 0.00
## A3GALT2
                                    0.00
                                                                 0.13
## A4GALT
                                    0.19
           NONCOVID_17_84y_female_ICU NONCOVID_18_88y_male_ICU
##
```

```
## A1BG
                                  0.37
                                                            0.33
## A1CF
                                  0.00
                                                            0.00
## A2M
                                  0.07
                                                            0.06
## A2ML1
                                                            0.00
                                  0.01
## A3GALT2
                                  0.18
                                                            0.00
## A4GAI.T
                                  0.00
                                                            0.00
           NONCOVID_19_66y_female_ICU NONCOVID_20_62y_female_ICU
## A1BG
                                  0.25
                                                              0.20
## A1CF
                                  0.00
                                                              0.00
## A2M
                                  0.11
                                                              0.01
## A2ML1
                                  0.00
                                                              0.02
## A3GALT2
                                  0.04
                                                              0.00
## A4GALT
                                  0.03
                                                              0.07
##
           NONCOVID_21_71y_male_NonICU NONCOVID_22_63y_male_NonICU
## A1BG
                                   0.40
                                                                0.30
## A1CF
                                   0.00
                                                                0.00
## A2M
                                   0.04
                                                                0.02
## A2ML1
                                   0.02
                                                                0.02
## A3GALT2
                                                                0.00
                                   0.00
## A4GALT
                                   0.00
                                                                0.00
##
           NONCOVID_23_42y_female_NonICU NONCOVID_24_32y_female_NonICU
## A1BG
                                     0.70
## A1CF
                                     0.00
                                                                    0.00
## A2M
                                                                    0.27
                                     0.02
## A2ML1
                                     0.01
                                                                    0.00
## A3GALT2
                                     0.00
                                                                    0.06
## A4GALT
                                                                    0.00
                                     0.00
           NONCOVID_25_62y_male_NonICU NONCOVID_26_36y_male_ICU
## A1BG
                                                             0.22
                                   2.80
## A1CF
                                   0.00
                                                             0.00
## A2M
                                   0.04
                                                             0.28
## A2ML1
                                   0.00
                                                             0.00
## A3GALT2
                                   0.00
                                                             0.00
## A4GALT
                                   0.00
                                                             0.00
str(genes)
## 'data.frame':
                    100 obs. of 126 variables:
   $ COVID_01_39y_male_NonICU
                                   : num 0.49 0 0.21 0.04 0.07 ...
## $ COVID_02_63y_male_NonICU
                                    : num 0.29 0 0.14 0 0 ...
## $ COVID_03_33y_male_NonICU
                                    : num 0.26 0 0.03 0.02 0 ...
## $ COVID_04_49y_male_NonICU
                                           0.45 0.01 0.09 0.07 0 ...
                                    : num
                                           0.17 0 0 0.05 0.07 0 0 8.45 1.17 0 ...
##
    $ COVID_05_49y_male_NonICU
                                    : num
                                           0.21 0 0.08 0.04 0 0 0.03 19.6 3.15 0 ...
##
    $ COVID_06_.y_male_NonICU
                                    : num
  $ COVID_07_38y_female_NonICU
                                           0.49 0.01 0.23 0.03 0.07 ...
                                    : num
                                           0.12 0 0.08 0.01 0 0 0 10.5 2.1 0 ...
  $ COVID_08_78y_male_ICU
                                    : num
   $ COVID_09_64y_female_ICU
                                           0.51 0.01 0.88 0.02 0.79 ...
                                    : num
## $ COVID_10_62y_male_ICU
                                           0.1 0 0.13 0.01 0.15 ...
                                    : num
```

: num 0.41 0.01 0.58 0 0.19 ...

: num

: num

: num

0.38 0.02 0.47 0.03 0.08 ...

0.45 0 0.16 0 1.75 0 0 16 3.61 0 ...

0.18 0 0.07 0.01 0 0 0 22.1 2.73 0 ...

: num 0.23 0 0.22 0.04 0.93 0 0.07 10.3 2.16 0 ...

: num 0.42 0 0.07 0 0.15 0.03 0 9.37 2.94 0 ...

\$ COVID\_11\_52y\_female\_NonICU

\$ COVID\_13\_37y\_male\_NonICU

## \$ COVID\_12\_50y\_male\_ICU

## \$ COVID\_14\_55y\_male\_ICU

## \$ COVID\_15\_68y\_male\_ICU ## \$ COVID\_16\_48y\_male\_NonICU

##

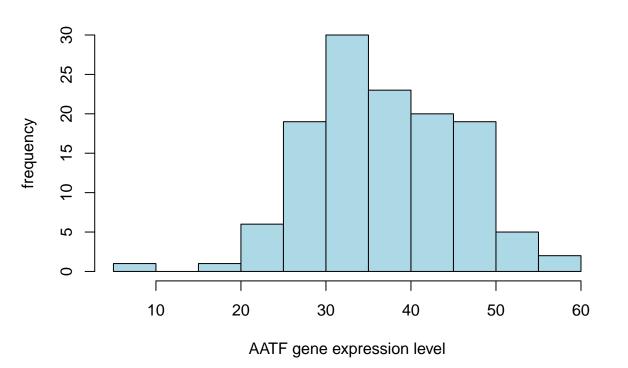
```
$ COVID_17_54y_male_NonICU
                                           0.63 0.02 0.15 0.02 0 ...
                                    : num
                                           0.47 0 0.3 0.02 0.06 ...
##
   $ COVID_18_70y_female_NonICU
                                    : num
  $ COVID 19 51y male NonICU
                                           0.33 0.02 0.11 0.02 0 ...
                                    : num
  $ COVID_20_62y_male_ICU
                                           0.32 0 0.07 0 0.22 ...
                                    : num
##
   $ COVID_21_66y_male_ICU
                                    : num
                                           0.18 0 0 0 0.37 0.03 0 7.1 1.11 0 ...
                                           0.09 0 0.06 0 0.06 0 0.06 5.17 1.05 0 ...
##
   $ COVID 22 43y male ICU
                                    : num
   $ COVID 23 76y male ICU
                                           0.18 0.01 0.03 0 0.07 0.03 0.04 8.87 1.45 0 ...
                                    : num
##
   $ COVID_24_55y_male_ICU
                                    : num
                                           0.22 0.01 0.11 0.02 0.15 ...
##
   $ COVID_25_55y_male_ICU
                                           0.29 0 0.09 0.03 0 ...
                                    : num
##
   $ COVID_26_41y_female_ICU
                                    : num
                                           0.42 0 0.18 0 0.87 ...
   $ COVID_27_71y_female_ICU
                                           0.16 0.01 0.23 0.01 0.18 ...
                                    : num
##
   $ COVID_28_63y_male_ICU
                                           0.18 0 0.18 0.05 0.45 ...
                                     num
##
   $ COVID_29_63y_female_ICU
                                           0.35 0 0.03 0.03 0.15 0.03 0.08 9.74 1.57 0 ...
                                     num
   $ COVID_30_54y_male_ICU
                                           0.23 0 0.11 0.01 0 ...
                                    : num
                                           0.15 0 0.47 0 0 0.03 0 10.4 1.74 0 ...
   $ COVID_31_50y_male_ICU
                                    : num
##
   $ COVID_32_72y_male_ICU
                                           0.34 0.01 0.04 0 0.29 0 0.04 8.96 1.88 0 ...
                                     num
##
   $ COVID_33_81y_male_NonICU
                                           0.35 0 0.3 0.06 0.26 ...
                                    : num
   $ COVID 34 64v female NonICU
                                           0.36 0 0.11 0 0.12 ...
                                    : num
   $ COVID_35_58y_female_NonICU
                                           0.26 0 0.51 0.02 0.16 ...
                                    : num
   $ COVID 36 68y male NonICU
                                    : num
                                           0.18 0.01 0.09 0 0.08 ...
##
  $ COVID_37_87y_male_NonICU
                                           0.2 0 0.09 0.07 0.31 ...
                                    : num
  $ COVID_38_68y_male_ICU
                                    : num
                                           0.29 0 0.1 0.02 0.35 ...
##
   $ COVID 39 80y female ICU
                                           0.19 0 0.27 0 0 ...
                                    : num
                                           0.22 0 0.17 0 0.08 0 0 14.6 2.47 0 ...
##
   $ COVID 40 66y male ICU
                                    : num
## $ COVID_41_74y_male_ICU
                                    : num
                                           0.19 0 0.14 0 0.19 0 0 6.63 1.21 0 ...
   $ COVID_42_21y_female_ICU
                                    : num
                                           0.24 0.01 0.33 0.01 0.39 0 0 15.1 2.23 0 ...
##
   $ COVID_43_83y_female_ICU
                                     num
                                           0.29 0 0 0 0.11 0 0 5.78 1.44 0 ...
##
   $ COVID_44_46y_male_ICU
                                           0.22 0 0.14 0 0 0.04 0 10.8 2.03 0 ...
                                     num
                                           0.14 0 0.15 0.03 0.19 0 0 5.36 1.26 0 ...
   $ COVID_45_62y_female_ICU
                                    : num
   $ COVID_46_62y_male_ICU
                                           0.53 0.01 0.1 0 0.06 ...
                                    : num
##
   $ COVID_47_78y_male_ICU
                                     num
                                           0.08 0.01 0.04 0.03 0.6 ...
##
   $ COVID_48_72y_female_ICU
                                           0.19 0 0.06 0.01 0.23 ...
                                    : num
   $ COVID_49_73y_male_ICU
                                           0.48 0 0.09 0.03 0 ...
                                    : num
##
   $ COVID_50_37y_male_ICU
                                           0.08 0 0.01 0 0 0.72 0 6.16 0.62 0 ...
                                    : num
   $ COVID_51_58y_female_NonICU
                                           0.21 0 0.13 0 0 ...
                                    : num
##
   $ COVID_52_71y_male_NonICU
                                    : num
                                           0.25 0.01 0 0.03 0 ...
  $ COVID 53 35y female NonICU
                                    : num
                                           0.25 0 0.64 0.1 0 ...
                                           0.09 0 0.09 0.01 0 ...
## $ COVID_55_62y_female_ICU
                                    : num
                                           0.28 0 0.16 0.09 0.23 ...
##
   $ COVID_56_33y_female_NonICU
                                    : num
## $ COVID_57_30y_female_NonICU
                                           0.42 0 0.27 0.01 0.19 ...
                                    : num
  $ COVID 58 62y male NonICU
                                    : num
                                           0.39 0 0.08 0 0 ...
                                           0.33 0 0.1 0 0.07 ...
##
   $ COVID_59_55y_male_NonICU
                                     num
##
   $ COVID_60_49y_male_NonICU
                                     nıım
                                           0.22 0 0.14 0 0 ...
##
                                           0.25 0 0.1 0.03 0.13 0 0 19.8 3.67 0 ...
   $ COVID_61_54y_female_NonICU
                                     num
   $ COVID_62_78y_female_ICU
                                           0.21 0 0.04 0 0.05 ...
                                    : num
##
   $ COVID_63_39y_female_ICU
                                     num
                                           0.29 0 0.01 0 0.14 ...
##
   $ COVID_64_65y_male_ICU
                                    : num
                                           0.38 0.01 0.04 0.02 0.56 0 0.04 9.99 2.14 0 ...
##
   $ COVID_65_84y_male_NonICU
                                    : num
                                           0.4 0.01 0.07 0 0.58 ...
   $ COVID_66_66y_female_NonICU
                                           0.64 0 0 0 0 ...
                                    : num
##
   $ COVID_67_57y_male_ICU
                                           0.37 0 0.35 0 0 ...
                                     num
## $ COVID_68_79y_male_ICU
                                           0.58 0 0.15 0.01 0 ...
                                    : num
## $ COVID_69_77y_female_NonICU
                                    : num
                                           0.52 0 0.29 0.02 0 0 0 23.4 4.18 0 ...
## $ COVID_70_81y_male_NonICU
                                           0.27 0 0.07 0 0 ...
                                    : num
## $ COVID 71 37y male ICU
                                          0.07 0.01 0.12 0.01 0 ...
                                    : num
```

```
## $ COVID_72_50y_female_NonICU
                                  : num 0.52 0 0.1 0.01 0 ...
                                         0.46 0.01 0.02 0.02 0.17 ...
## $ COVID_73_82y_male_NonICU
                                  : num
## $ COVID 74 55y female ICU
                                   : num
                                         0.24 0 0.12 0.02 0.26 ...
## $ COVID_75_55y_male_NonICU
                                         0.23 0.01 0.14 0 0 ...
                                   : num
## $ COVID_76_73y_female_ICU
                                   : num
                                         0.17 0 0.09 0.01 0.04 0 0.04 7.88 0.83 0 ...
                                   : num 0.05 0 0.01 0 0 ...
## $ COVID 77 55y female ICU
## $ COVID 78 80y male NonICU
                                   : num
                                         0.19 0 0.2 0 0 ...
## $ COVID_79_27y_male_NonICU
                                   : num
                                         0.08 0.01 0.03 0 0 ...
## $ COVID_80_71y_male_ICU
                                   : num
                                         0.28 0 0.05 0 0.05 ...
## $ COVID_82_67y_male_NonICU
                                   : num
                                         0.39 0.01 0.1 0 0 0 0 17.1 2.31 0 ...
## $ COVID_83_85y_female_NonICU
                                   : num
                                         0.47 0 0.18 0.05 0 ...
## $ COVID_84_75y_female_NonICU
                                         0.35 0 0.03 0 0.17 ...
                                   : num
## $ COVID_85_62y_male_ICU
                                         0.29 0 0.04 0 0 ...
                                   : num
## $ COVID_86_52y_female_NonICU
                                   : num
                                         0.6 0 0.27 0.02 0 ...
## $ COVID_87_61y_male_ICU
                                   : num
                                         0.65 0 0.15 0 0 ...
## $ COVID_89_90y_female_NonICU
                                   : num
                                         0.2 0 0.07 0.03 0.14 0 0 14.8 1.67 0 ...
## $ COVID_90_86y_female_NonICU
                                   : num
                                         0.4 0 0.05 0.01 0.31 ...
## $ COVID 91 29v female NonICU
                                         0.6 0 0.03 0.02 0.05 ...
                                   : num
                                         0.34 0 0.02 0.04 0.58 ...
## $ COVID_92_82y_female_ICU
                                   : num
## $ COVID_93_81y_female_ICU
                                   : num
                                         0.37 0 0.11 0 0.05 ...
## $ COVID_94_24y_female_NonICU
                                  : num 0.81 0 0.17 0.02 0 ...
## $ COVID_95_49y_male_NonICU
                                         0.37 0.01 0.2 0.02 0.15 ...
                                   : num
                                         1.61 0 0.02 0 0 ...
## $ COVID_96_51y_male_NonICU
                                   : num
                                         0.19 0 0.02 0.05 0.12 ...
## $ COVID_97_76y_male_ICU
                                   : num
## $ COVID_98_81y_male_NonICU
                                   : num 0.78 0 0.26 0 0.37 ...
## $ COVID_99_71y_male_ICU
                                   : num
                                         0.33 0 0.02 0 0.04 0 0 9.76 1.11 0 ...
## $ COVID_100_74y_female_NonICU : num
                                         0.3 0 0.09 0 0.04 0 0.02 18.4 1.84 0 ...
                                   : num 0.33 0 0.11 0.03 0.05 ...
## $ COVID_101_58y_male_ICU
## $ COVID_102_84y_male_NonICU
                                   : num 0.12 0 0.01 0.01 0 0.07 0 9.1 1.06 0 ...
     [list output truncated]
# from the str() we can find continuous covariate and categorical covariates
library(stringr)
library(dbplyr)
sample.names <- colnames(genes)</pre>
# continuous covariate is age
# extract age from names
# eq.name is COVUD_01_39y_male_NonICU
# age: we ask for find the "_"before age and y after age, so that we can extract ages from name
age <- as.numeric(str_extract(sample.names, "(?<=_)[0-9]+(?=y)"))
age
     [1] 39 63 33 49 49 NA 38 78 64 62 52 50 37 55 68 48 54 70 51 62 66 43 76 55 55
##
##
   [26] 41 71 63 63 54 50 72 81 64 58 68 87 68 80 66 74 21 83 46 62 62 78 72 73 37
## [51] 58 71 35 62 33 30 62 55 49 54 78 39 65 84 66 57 79 77 81 37 50 82 55 55 73
## [76] 55 80 27 71 67 85 75 62 52 61 90 86 29 82 81 24 49 51 76 81 71 74 58 84 83
## [101] 54 65 65 90 83 75 50 53 49 67 58 82 65 75 83 40 84 88 66 62 71 63 42 32 62
## [126] 36
# two categorical covariates are sex (male/female) and status (ICU/NonICU)
# sex: we ask for find the "_"before sex and status after sex to extract
sex <- str_extract(sample.names,"(?<=_)[a-zA-Z]+(?=_ICU|_NonICU)")</pre>
```

```
##
     [1] "male"
                    "male"
                              "male"
                                         "male"
                                                   "male"
                                                              "male"
                                                                        "female"
##
     [8] "male"
                              "male"
                                                              "male"
                                                                         "male"
                    "female"
                                         "female"
                                                   "male"
                    "male"
                                                                         "male"
##
    [15] "male"
                              "male"
                                         "female"
                                                   "male"
                                                              "male"
    [22] "male"
                    "male"
                              "male"
                                                              "female"
##
                                         "male"
                                                   "female"
                                                                        "male"
##
    [29] "female"
                    "male"
                              "male"
                                         "male"
                                                   "male"
                                                              "female"
                                                                        "female"
    [36] "male"
                    "male"
                              "male"
                                         "female"
                                                   "male"
                                                              "male"
                                                                        "female"
##
    [43] "female"
                    "male"
                              "female"
                                         "male"
                                                   "male"
                                                              "female"
                                                                        "male"
##
    [50] "male"
                              "male"
                                                              "female"
                                                                        "female"
##
                    "female"
                                         "female"
                                                   "female"
##
    [57] "male"
                    "male"
                              "male"
                                         "female"
                                                   "female"
                                                              "female"
                                                                        "male"
    [64] "male"
                    "female"
                              "male"
                                         "male"
                                                   "female"
                                                              "male"
                                                                         "male"
##
    [71] "female"
                    "male"
                              "female"
                                         "male"
                                                   "female"
                                                              "female"
                                                                        "male"
                    "male"
    [78] "male"
                              "male"
                                         "female"
                                                   "female"
                                                              "male"
                                                                        "female"
##
##
    [85] "male"
                    "female"
                              "female"
                                         "female"
                                                   "female"
                                                              "female"
                                                                        "female"
                    "male"
                              "male"
                                         "male"
                                                   "male"
                                                              "female"
                                                                        "male"
##
    [92] "male"
   [99] "male"
                    "male"
                              "female"
                                         "male"
                                                   "male"
                                                              "male"
                                                                         "female"
##
## [106] "female"
                    "male"
                              "female"
                                         "female"
                                                   "male"
                                                              "female"
                                                                         "male"
   [113] "male"
                    "female"
                              "unknown" "female"
                                                              "male"
                                                                        "female"
##
                                                   "female"
## [120] "female"
                    "male"
                              "male"
                                         "female"
                                                   "female"
                                                              "male"
                                                                         "male"
# status:extract either NonICU or ICU
status <- ifelse(str_detect(sample.names, "NonICU$"), "ICU", "NonICU")</pre>
status
     [1] "ICU"
                   "ICU"
                            "ICU"
                                      "ICU"
                                               "ICU"
                                                         "ICU"
                                                                  "ICU"
##
                                                                            "NonICU"
##
     [9] "NonICU" "NonICU" "ICU"
                                      "NonICU" "ICU"
                                                         "NonICU" "NonICU" "ICU"
    [17] "ICU"
                   "ICU"
                            "ICU"
                                      "NonICU" "NonICU" "NonICU" "NonICU"
##
    [25] "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU"
##
    [33] "ICU"
                   "ICU"
                            "ICU"
                                      "ICU"
                                               "ICU"
                                                         "NonICU" "NonICU" "NonICU"
##
    [41] "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU"
##
##
    [49] "NonICU" "NonICU" "ICU"
                                      "ICU"
                                               "ICU"
                                                         "NonICU" "ICU"
                                                                            "ICU"
                            "ICU"
    [57] "ICU"
                   "ICU"
                                      "ICU"
                                               "NonICU" "NonICU" "NonICU" "ICU"
##
    [65] "ICU"
                   "NonICU" "NonICU" "ICU"
                                               "ICU"
                                                         "NonICU" "ICU"
##
                                                                            "ICU"
    [73] "NonICU" "ICU"
                            "NonICU" "NonICU" "ICU"
                                                         "ICU"
                                                                  "NonICU" "ICU"
##
                            "NonICU" "ICU"
                                               "NonICU" "ICU"
##
    [81] "ICU"
                   "ICU"
                                                                  "ICU"
                                                                            "ICU"
##
    [89] "NonICU" "NonICU" "ICU"
                                      "ICU"
                                               "ICU"
                                                         "NonICU" "ICU"
                                                                            "NonICU"
##
    [97] "ICU"
                   "NonICU" "ICU"
                                      "ICU"
                                               "ICU"
                                                         "NonICU" "NonICU" "ICU"
## [105] "ICU"
                   "NonICU" "NonICU" "ICU"
                                                         "NonICU" "ICU"
                                                                            "NonICU"
## [113] "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU" "NonICU"
                                      "ICU"
## [121] "ICU"
                   "ICU"
                            "ICU"
                                               "ICU"
                                                         "NonICU"
# gene.AATF: get the AATF value from the genes dataset
# since all the values are numbers, so we use as.numeric
gene.AATF <- as.numeric(unlist(genes["AATF", ]))</pre>
head(gene.AATF)
## [1] 45.83 39.37 42.35 41.92 30.56 36.30
# use function data frame put them in to a new summary dataset covid.data
covid.data <- data.frame(</pre>
  sample = sample.names,
  sex = sex,
  age = age,
  status = status,
```

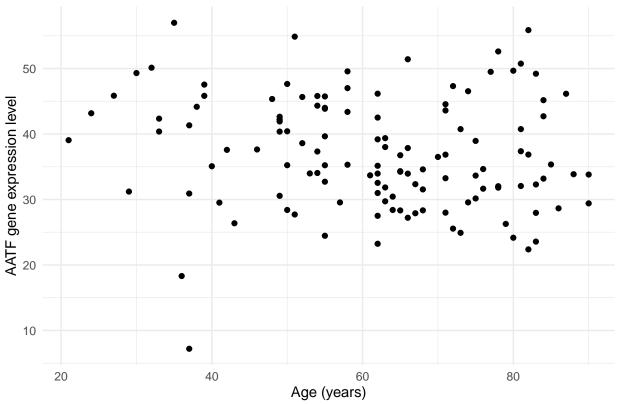
```
gene.value = gene.AATF
head(covid.data)
##
                       sample sex age status gene.value
## 1 COVID_01_39y_male_NonICU male
                                    39
                                           ICU
                                                    45.83
## 2 COVID_02_63y_male_NonICU male
                                           ICU
                                                    39.37
## 3 COVID_03_33y_male_NonICU male
                                           ICU
                                                    42.35
## 4 COVID_04_49y_male_NonICU male
                                                    41.92
                                           ICU
## 5 COVID_05_49y_male_NonICU male
                                           ICU
                                                    30.56
## 6 COVID 06 .y male NonICU male
                                           ICU
                                                    36.30
# Histogram for gene expression
histogram.gene <- hist(covid.data$gene.value, main = "Histogram for AATF gene expression",
                       xlab = "AATF gene expression level",
                       ylab = "frequency",
                       col = "lightblue")
```

## **Histogram for AATF gene expression**

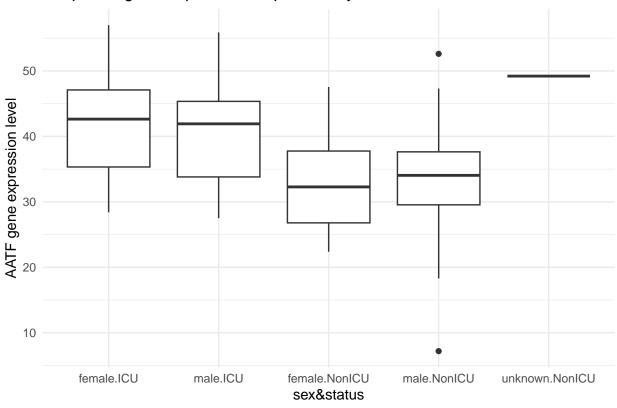


## Warning: Removed 1 row containing missing values or values outside the scale range
## ('geom\_point()').

## Scatter plot for gene expression and age



### Boxplot of gene expression separated by sex and status

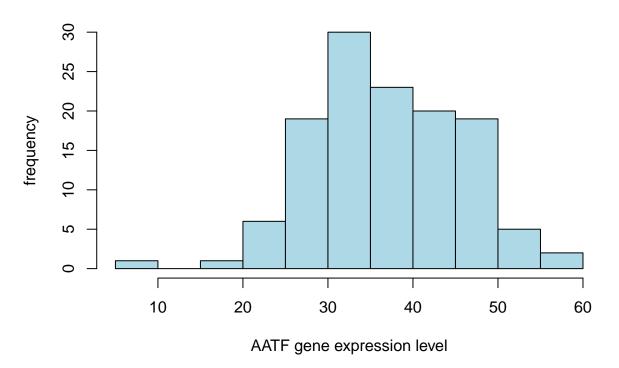


#### Submission 2

```
\# build a function to create the plots I made for Presentation 1
library(ggplot2)
library(stringr)
three.in.one.plot <- function(genes){</pre>
  # one continuous covariate is age
  # two categorical covariates are sex (male/female) and status (ICU/NonICU)
  sample.names <- colnames(genes)</pre>
  age <- as.numeric(str_extract(sample.names, "(?<=_)[0-9]+(?=y)"))
  sex <- str_extract(sample.names,"(?<=_)[a-zA-Z]+(?=_ICU|_NonICU)")</pre>
  status <- ifelse(str_detect(sample.names,"NonICU$"), "ICU", "NonICU")</pre>
  # gene name:gene.AATF
  # the gene I chose
  gene.AATF <- as.numeric(unlist(genes["AATF", ]))</pre>
  # name of the data frame: covid.data
  # use function data frame put them in to a new summary dataset covid.data
  covid.data <- data.frame(</pre>
    sample = sample.names,
    sex = sex,
    age = age,
    status = status,
    gene.value = gene.AATF
```

```
# histogram for gene expression
  histogram.gene <- hist(covid.data$gene.value, main = "Histogram for AATF gene expression",
                       xlab = "AATF gene expression level",
                       ylab = "frequency",
                       col = "lightblue")
  # Scatter plot for gene expression and continuous covariate
  scatter.plot.gene <- ggplot(covid.data, aes(x = age, y = gene.value)) +</pre>
                    # add points to our scatter plot
                    geom_point() +
                    # change labels
                    labs(title = "Scatter plot for gene expression and age",
                    x = "Age (years)",y = "AATF gene expression level") +
                    theme_minimal()
  print(scatter.plot.gene)
  # Box plot of gene expression separated by both categorical covariates
  box.plot.gene <- ggplot(covid.data, aes(x = interaction(sex, status), y = gene.value)) +</pre>
                    # add box plot
                    geom_boxplot() +
                    # change labels
                    labs(title = "Boxplot of gene expression separated by sex and status",
                    x = "sex&status",y = "AATF gene expression level") +
                    theme_minimal()
 print(box.plot.gene)
three.in.one.plot(genes)
```

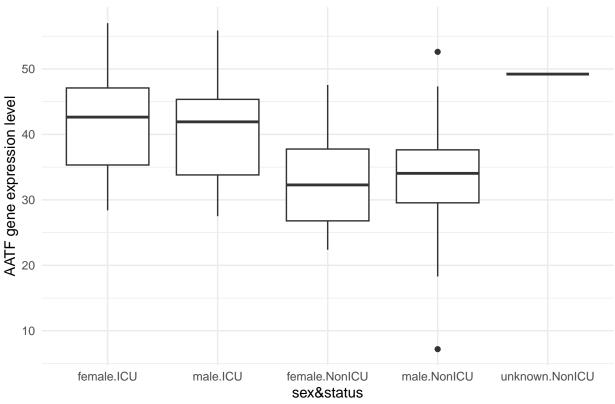
# **Histogram for AATF gene expression**



## Warning: Removed 1 row containing missing values or values outside the scale range
## ('geom\_point()').







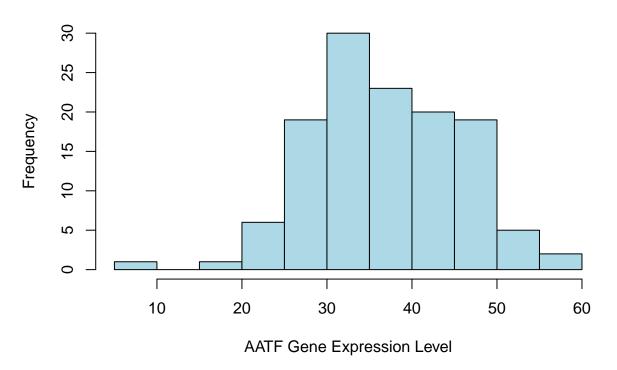
#### fixed Submission 2

```
library(ggplot2)
library(stringr)
library(dplyr)
```

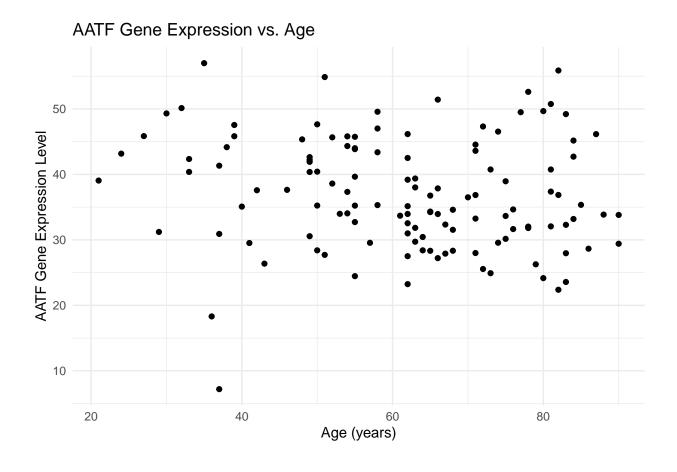
```
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:dbplyr':
##
##
       ident, sql
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
three.in.one.plot <- function(genes) {</pre>
  sample.names <- colnames(genes)</pre>
```

```
# extract covariates
  age <- as.numeric(str_extract(sample.names, "(?<=_)[0-9]+(?=y)"))
  sex_raw <- str_extract(sample.names, "(?<=_)[a-zA-Z]+(?=_ICU|_NonICU)")</pre>
  status raw <- ifelse(str detect(sample.names, "NonICU$"), "ICU", "Non-ICU")
  Sex <- case_when(tolower(sex_raw) == "male" ~ "Male", tolower(sex_raw) == "female" ~ "Female", TRUE
  Status <- status_raw
         <- factor(Sex, levels = c("Female", "Male", "Unknown"))</pre>
  Status <- factor(Status, levels = c("Non-ICU", "ICU"))
  SexStatus <- factor(paste(Sex, Status, sep = " & "),</pre>
                      levels = c("Female & ICU", "Male & ICU", "Female & Non-ICU", "Male & Non-ICU", "Unk
  # AATF expression
  gene.AATF <- as.numeric(unlist(genes["AATF", ]))</pre>
  covid.data <- data.frame(</pre>
   sample = sample.names,
   Age= age,
    Sex = Sex,
    Status = Status,
    SexStatus = SexStatus,
    gene.value = gene.AATF
  # Histogram (capitalized labels)
  hist(covid.data$gene.value,
       main = "Histogram of AATF Gene Expression",
       xlab = "AATF Gene Expression Level",
       ylab = "Frequency",
       col = "lightblue")
  # Scatter plot (capitalized labels)
  p_scatter <- ggplot(covid.data, aes(x = Age, y = gene.value)) +</pre>
    geom_point() +
    labs(title = "AATF Gene Expression vs. Age",
         x = "Age (years)", y = "AATF Gene Expression Level") +
    theme_minimal()
  print(p_scatter)
  # Box plot with x-axis
  p_box <- ggplot(covid.data, aes(x = SexStatus, y = gene.value)) +</pre>
    geom_boxplot() +
    labs(title = "AATF Gene Expression by Sex and Status",
         x = "Sex and Status", y = "AATF Gene Expression Level") +
    theme_minimal() +
    theme(axis.text.x = element_text(angle = 30, hjust = 1))
  print(p_box)
three.in.one.plot(genes)
```

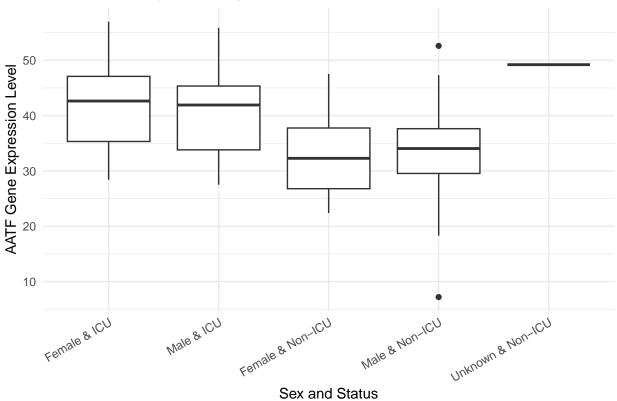
# **Histogram of AATF Gene Expression**



## Warning: Removed 1 row containing missing values or values outside the scale range
## ('geom\_point()').







Final Project

LaTeX of summary statistics

```
library(dplyr)
library(knitr)
library(kableExtra)
## Attaching package: 'kableExtra'
## The following object is masked from 'package:dplyr':
##
##
       group_rows
set.seed(103)
# since this data set has no more 2 additional continuous and 1 additional categorical variable
# so I did created additional categorical variable
# previous continuous covariate is age
# new continuous covariate are CRP and AATF expression
# C-reactive protein which also called CRP, this is a common bio data of inflammation in blood, measure
covid.data$crp.mg.l. <- round(rnorm(nrow(covid.data), mean = 10, sd = 5), 2)</pre>
# previous two categorical covariates are sex (male/female) and status (ICU/NonICU)
# new categorical covariates is vaccinate whether the patient did or did not fully vaccinated
```

```
covid.data$vaccinated <- sample(c("Yes", "No"), nrow(covid.data), replace = TRUE)</pre>
# LaTeX summary table
summary_table <- covid.data %>%
  group_by(status) %>%
  summarise(n = n(),
    # No.1 categorical variable: sex
   male.n = sum(sex == "male"),
   male.pct = round(100 * mean(sex == "male"), 1),
   # No.2 categorical variable: vaccinated
   vaccinated.yes = sum(vaccinated == "Yes"),
   vaccinated.yes.pct = round(100 * mean(vaccinated == "Yes"), 1),
    # No.3 categorical variable: status (reported as ICU = yes)
    #status.icu.n = sum(status == "ICU"),
    #status.icu.pct = round(100 * mean(status == "ICU"), 1),
    # No.1 continuous variable: age
    age.mean = round(mean(age, na.rm = TRUE), 1),
   age.sd = round(sd(age, na.rm = TRUE), 1),
    # No.2 continuous variable: gene.value
   gene.mean = round(mean(gene.value, na.rm = TRUE), 2),
    gene.sd = round(sd(gene.value, na.rm = TRUE), 2),
   # No.3 continuous variable: crp.mg.l.
   crp.mean = round(mean(crp.mg.l., na.rm = TRUE), 2),
    crp.sd = round(sd(crp.mg.l., na.rm = TRUE), 2)
  ) %>%
  mutate(
    `Sex (male)` = pasteO(male.n, " (", male.pct, "%)"),
    `Vaccinated (Yes)` = pasteO(vaccinated.yes, " (", vaccinated.yes.pct, "%)"),
                         = pasteO(status.icu.n, " (", status.icu.pct, "%)"),
    \#`Status = ICU`
   `Age` = paste0(age.mean, " (", age.sd, ")"),
   `AATF gene` = pasteO(gene.mean, " (", gene.sd, ")"),
    `CRP (mg/L)` = pasteO(crp.mean, " (", crp.sd, ")")
  select(status, n, `Sex (male)`, `Vaccinated (Yes)`, Age, `AATF gene`, `CRP (mg/L)`)
kable(summary_table, format = "latex", booktabs = TRUE, caption = "Summary Statistics Stratified by Sta
  kable_styling(latex_options = c("hold_position", "striped"))
```

Table 1: Summary Statistics Stratified by Status

status	n	Sex (male)	Vaccinated (Yes)	Age	AATF gene	CRP (mg/L)
ICU	60	33 (55%)	24 (40%)	59.7 (18.4)	40.67(7.7)	9.65 (4.51)
NonICU	66	41~(62.1%)	32 (48.5%)	63.5 (14)	$33.56 \ (7.75)$	10.95 (4.87)

```
library(tibble)
library(knitr)
library(kableExtra)

summary_table_t <- summary_table %>%
    t() %>%
    as.data.frame(check.names = FALSE) %>%
    rownames_to_column(var = "Status")

colnames(summary_table_t) <- c( "Status", as.character(unlist(summary_table_t[summary_table_t$Status == ))
    summary_table_t <- summary_table_t[summary_table_t$Status != "status", ]

kable(summary_table_t,
    format = "latex", booktabs = TRUE,
    caption = "Summary Statistics Stratified by Status") %>%
    kable_styling(latex_options = c("hold_position", "striped"))
```

Table 2: Summary Statistics Stratified by Status

	Status	ICU	NonICU
2	n	60	66
3	Sex (male)	33~(55%)	41~(62.1%)
4	Vaccinated (Yes)	24 (40%)	32~(48.5%)
5	Age	59.7(18.4)	63.5 (14)
6	AATF gene	40.67(7.7)	33.56 (7.75)
7	CRP (mg/L)	9.65 (4.51)	$10.95 \ (4.87)$

#### Generate a heatmap

```
# levels(annotation.col$Sex)
```

```
library(ggplot2)
library(stringr)
library(pheatmap)

# 18 genes
# choose a lot of similar names of genes
gene.list <- c("AATF", "ABCA3", "ABCA4", "ABCA5", "ABCA6", "ABCA7", "ABCA8", "ABCA9", "ABCB1","ABCC2",
valid.genes <- gene.list[gene.list %in% rownames(genes)]

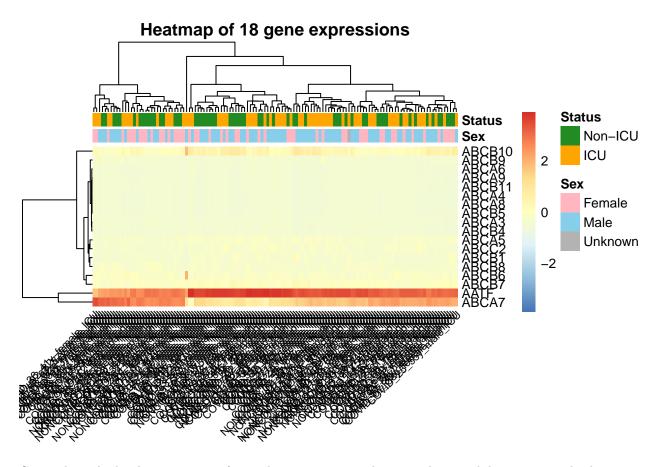
# numeric gene matrix
gene.matrix <- t(sapply(valid.genes, function(g) as.numeric(genes[g, ])))
rownames(gene.matrix) <- valid.genes
colnames(gene.matrix) <- colnames(genes)

# remove NA
gene.matrix[!is.finite(gene.matrix)] <- NA
# impute missing values by row mean
# if entire row is NA, fill with 0</pre>
```

```
gene.matrix <- t(apply(gene.matrix, 1, function(x) {</pre>
  if (all(is.na(x))) {
    x[is.na(x)] \leftarrow 0
  } else {
    x[is.na(x)] <- mean(x, na.rm = TRUE)
 return(x)
}))
# annotation dataframe
sample.names <- colnames(genes)</pre>
         <- stringr::str_extract(sample.names, "(?<=_)[A-Za-z]+(?=_ICU|_NonICU)")</pre>
status_raw <- ifelse(stringr::str_detect(sample.names, "NonICU$"), "Non-ICU", "ICU")
# capitalize each labels
Sex <- factor(tolower(sex_raw),levels = c("female","male","unknown"),</pre>
              labels = c("Female","Male","Unknown"))
Status <- factor(status_raw, levels = c("Non-ICU", "ICU"))</pre>
annotationData <- data.frame(Sex = Sex, Status = Status, row.names = sample.names)
# color for each variable
annotationColors <- list(</pre>
 Sex = c("Female" = "lightpink", "Male" = "skyblue", "Unknown" = "gray70"),
 Status = c("Non-ICU" = "forestgreen", "ICU" = "orange")
# draw heatmap
pheatmap(
 mat = gene.matrix,
  scale = "column", # not really sure if we need this, class note did not have this
  annotation_col = annotationData,
  annotation_colors = annotationColors,
  clustering_distance_rows = "euclidean",
  clustering_distance_cols = "euclidean",
  clustering_method = "complete",
  show_colnames = FALSE,
 fontsize_row = 10,
 main = "Heatmap of 18 gene expressions"
```



```
# if we need all the variables name
pheatmap(
    mat = gene.matrix,
    scale = "column",
    annotation_col = annotationData,
    annotation_colors = annotationColors,
    clustering_distance_rows = "euclidean",
    clustering_distance_cols = "euclidean",
    clustering_method = "complete",
    show_colnames = TRUE,
    show_rownames = TRUE,
    angle_col = 45,
    fontsize_row = 10,
    fontsize_col = 8,
    main = "Heatmap of 18 gene expressions" )
```



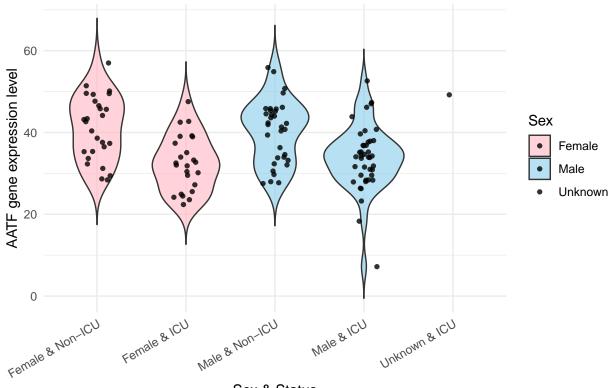
Going through the documentation for ggplot2, generate a plot type that we did not previously discuss in class that describes data in a new and unique way

```
library(ggplot2)
library(stringr)
sample.names <- colnames(genes)</pre>
           <- str_extract(sample.names, "(?<=_)[A-Za-z]+(?=_ICU|_NonICU)")
status_raw <- ifelse(str_detect(sample.names, "NonICU$"), "Non-ICU", "ICU")</pre>
# capitalize each labels
Sex <- factor(tolower(sex_raw),levels = c("female","male","unknown"), labels = c("Female","Male","Unknown")
Status <- factor(status_raw, levels = c("Non-ICU","ICU"))</pre>
# combined x-axis label
SexStatus <- factor(paste(Sex, Status, sep = " & "),levels = c("Female & Non-ICU", "Female & ICU", "Male
gene.AATF <- as.numeric(genes["AATF", , drop = TRUE])</pre>
covid.data <- data.frame(</pre>
  sample = sample.names,
 Sex = Sex,
 Status = Status,
 SexStatus = SexStatus,
  gene.value = gene.AATF
```

```
# Violin plot with jittered points
ggplot(covid.data, aes(x = SexStatus, y = gene.value, fill = Sex)) +
  geom_violin(trim = FALSE, alpha = 0.6) +
  geom_jitter(width = 0.15, alpha = 0.8, size = 1.2, color = "black") +
  labs(title = "AATF gene expression by Sex and Status",
        x = "Sex & Status",
        y = "AATF gene expression level",
        fill = "Sex") +
    theme_minimal() +
    theme(axis.text.x = element_text(angle = 30, hjust = 1)) +
    scale_fill_manual(values = c("Female" = "lightpink", "Male" = "skyblue", "Unknown" = "gray70"))
```

## Warning: Groups with fewer than two datapoints have been dropped.
## i Set 'drop = FALSE' to consider such groups for position adjustment purposes.

### AATF gene expression by Sex and Status



Sex & Status

```
# R package Reference
citation("dplyr")
```

```
## To cite package 'dplyr' in publications use:
##
## Wickham H, François R, Henry L, Müller K, Vaughan D (2023). _dplyr: A
## Grammar of Data Manipulation_. R package version 1.1.4,
```

```
##
     <https://CRAN.R-project.org/package=dplyr>.
##
## A BibTeX entry for LaTeX users is
##
##
     @Manual{,
       title = {dplyr: A Grammar of Data Manipulation},
##
       author = {Hadley Wickham and Romain François and Lionel Henry and Kirill Müller and Davis Vaugha
##
##
       year = \{2023\},\
##
       note = {R package version 1.1.4},
##
       url = {https://CRAN.R-project.org/package=dplyr},
##
citation("ggplot2")
## To cite ggplot2 in publications, please use
##
     H. Wickham. ggplot2: Elegant Graphics for Data Analysis.
##
##
     Springer-Verlag New York, 2016.
##
## A BibTeX entry for LaTeX users is
##
##
     @Book{,
##
       author = {Hadley Wickham},
       title = {ggplot2: Elegant Graphics for Data Analysis},
##
##
       publisher = {Springer-Verlag New York},
##
       year = \{2016\},\
       isbn = \{978-3-319-24277-4\},
##
##
       url = {https://ggplot2.tidyverse.org},
##
     }
citation("pheatmap")
## To cite package 'pheatmap' in publications use:
##
##
     Kolde R (2025). _pheatmap: Pretty Heatmaps_. R package version
##
     1.0.13, <a href="https://CRAN.R-project.org/package=pheatmap">https://CRAN.R-project.org/package=pheatmap</a>.
##
## A BibTeX entry for LaTeX users is
##
##
     @Manual{,
##
       title = {pheatmap: Pretty Heatmaps},
##
       author = {Raivo Kolde},
       year = \{2025\},\
##
       note = {R package version 1.0.13},
##
##
       url = {https://CRAN.R-project.org/package=pheatmap},
##
     }
citation("knitr")
## To cite package 'knitr' in publications use:
##
##
     Xie Y (2025). _knitr: A General-Purpose Package for Dynamic Report
```

```
##
     Generation in R_. R package version 1.50, <a href="https://yihui.org/knitr/">https://yihui.org/knitr/>.
##
##
     Yihui Xie (2015) Dynamic Documents with R and knitr. 2nd edition.
     Chapman and Hall/CRC. ISBN 978-1498716963
##
##
     Yihui Xie (2014) knitr: A Comprehensive Tool for Reproducible
##
     Research in R. In Victoria Stodden, Friedrich Leisch and Roger D.
##
     Peng, editors, Implementing Reproducible Computational Research.
##
##
     Chapman and Hall/CRC. ISBN 978-1466561595
##
## To see these entries in BibTeX format, use 'print(<citation>,
## bibtex=TRUE)', 'toBibtex(.)', or set
## 'options(citation.bibtex.max=999)'.
citation("kableExtra")
## To cite package 'kableExtra' in publications use:
##
##
     Zhu H (2024). kableExtra: Construct Complex Table with 'kable' and
     Pipe Syntax . R package version 1.4.0,
##
     <https://CRAN.R-project.org/package=kableExtra>.
##
##
## A BibTeX entry for LaTeX users is
##
##
     @Manual{,
       title = {kableExtra: Construct Complex Table with 'kable' and Pipe Syntax},
##
##
       author = {Hao Zhu},
       year = \{2024\},\
##
##
       note = {R package version 1.4.0},
       url = {https://CRAN.R-project.org/package=kableExtra},
##
##
     }
citation("stringr")
## To cite package 'stringr' in publications use:
##
     Wickham H (2023). stringr: Simple, Consistent Wrappers for Common
##
     String Operations_. R package version 1.5.1,
##
##
     <https://CRAN.R-project.org/package=stringr>.
##
## A BibTeX entry for LaTeX users is
##
##
     @Manual{,
##
       title = {stringr: Simple, Consistent Wrappers for Common String Operations},
##
       author = {Hadley Wickham},
       year = \{2023\},\
##
       note = {R package version 1.5.1},
##
       url = {https://CRAN.R-project.org/package=stringr},
##
##
citation("tibble")
```

```
## To cite package 'tibble' in publications use:
##
     Müller K, Wickham H (2023). _tibble: Simple Data Frames_. R package
##
##
     version 3.2.1, <a href="https://CRAN.R-project.org/package=tibble">https://CRAN.R-project.org/package=tibble</a>.
##
## A BibTeX entry for LaTeX users is
##
     @Manual{,
        title = {tibble: Simple Data Frames},
##
        author = {Kirill Müller and Hadley Wickham},
##
        year = {2023},
##
       note = {R package version 3.2.1},
       url = {https://CRAN.R-project.org/package=tibble},
##
##
     }
```