EDA of Human Cardiac Tissue-specific Proteome (Feb 23 2021) CaseOLAP Scores - Full Text

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Load libraries

```
suppressMessages(library(tidyverse))
suppressMessages(library(ggplot2))
```

Load Data

```
# Human reference proteome - Mar 29 2021 with PMC full text
human_full <- read_csv("https://raw.githubusercontent.com/asjew/heart_caseolap_EDA/main/Data/Human%20re
## -- Column specification -----
     protein = col_character(),
##
##
     IHD = col_double(),
     CM = col_double(),
##
     ARR = col_double(),
##
     VD = col_double(),
     CHD = col_double(),
##
     CCD = col_double(),
##
     VOO = col_double(),
     OTH = col_double()
##
## )
head(human_full)
```

```
## # A tibble: 6 x 9
    protein
                IHD
                        CM
                              ARR
                                      VD
                                           CHD
                                                  CCD
                                                        V00
                                                               OTH
                                        <dbl>
    <chr>
               <dbl>
                      <dbl>
                             <dbl>
                                    <dbl>
                                                <dbl>
                                                      <dbl>
                                                             <dbl>
## 1 p01137
             ## 2 a0a0c4dga6 0.0127 0.00687 0
                                  0.0122 0
                                                      0.0131 0.00705
                                               0
## 3 e5ri75
             0
                    0.0130 0.0134 0
                                               0.0144 0
             0.00672 0
                           0.00893 0.00746 0
## 4 f5h5q2
                                                      0
                                                            0.00445
## 5 c9jhz9
                    0.00433 0
                                  0.00746 0
                                                            0.00445
## 6 e7ew20
            0.00847 0.0196 0.00708 0.0169 0
                                              0.00762 0
                                                            0.0141
```

```
summary(human_full)
                             IHD
                                                                    ARR
##
      protein
                                                 CM
    Length: 53145
                               :0.000000
                                                  :0.000000
                                                                      :0.000000
                       Min.
                                           Min.
                                                               Min.
    Class : character
                       1st Qu.:0.000000
                                           1st Qu.:0.000000
                                                               1st Qu.:0.000000
    Mode :character
                       Median :0.006716
                                           Median :0.004334
                                                               Median :0.000000
##
##
                       Mean
                               :0.010833
                                           Mean
                                                  :0.010081
                                                               Mean
                                                                      :0.005698
##
                       3rd Qu.:0.016134
                                           3rd Qu.:0.015539
                                                               3rd Qu.:0.007079
##
                       Max.
                               :0.207226
                                           Max.
                                                  :0.204358
                                                               Max.
                                                                      :0.138092
                            CHD
                                                CCD
##
          VD
                                                                    V00
           :0.000000
   Min.
                               :0.000000
                                                  :0.000000
##
                       Min.
                                           Min.
                                                               Min.
                                                                      :0.00000
    1st Qu.:0.000000
                       1st Qu.:0.000000
                                           1st Qu.:0.000000
                                                               1st Qu.:0.00000
                       Median :0.004614
                                           Median :0.000000
  Median :0.000000
                                                               Median :0.00000
    Mean
          :0.005154
                       Mean
                               :0.007754
                                           Mean
                                                  :0.003062
                                                               Mean
                                                                      :0.00226
##
    3rd Qu.:0.007458
                       3rd Qu.:0.011924
                                           3rd Qu.:0.000000
                                                               3rd Qu.:0.00000
           :0.110973
                       Max.
                              :0.110199
                                           Max.
                                                  :0.112764
                                                               Max.
                                                                      :0.10759
         OTH
##
           :0.000000
##
   Min.
   1st Qu.:0.000000
## Median :0.004447
## Mean
           :0.008364
    3rd Qu.:0.012485
```

Exploratory Data Analysis

:0.117415

Max.

8 q8iwv8

0

```
# Finding proteins that are strictly exclusive to VOO (all groups are 0 except VOO)
# None in this dataset
which(human full$IHD == 0 & human full$CM == 0 & human full$ARR == 0 &
       human_full$VD == 0 & human_full$CHD == 0 & human_full$CCD == 0 & human_full$OTH == 0)
## integer(0)
# Get index of proteins that have caseolap score < 0.01 in all groups except VOO and where VOO > 0.01
VOO_01 <- which(human_full$IHD < 0.01 & human_full$CM < 0.01 & human_full$ARR < 0.01 &
                  human_full$VD < 0.01 & human_full$CHD < 0.01 & human_full$CCD < 0.01 &
                  human_full$OTH < 0.01 & human_full$V00 > 0.01)
human_full[V00_01, ] # Displaying the proteins and caseolap scores with indices V00_01
## # A tibble: 8 x 9
     protein
                 IHD
                          CM
                                ARR
                                         VD
                                                CHD
                                                      CCD
                                                             000
                                                                      OTH
               <dbl>
                       <dbl> <dbl>
                                                                    <dbl>
     <chr>>
                                      <dbl>
                                              <dbl> <dbl>
                                                           <dbl>
## 1 e9ppe6 0
                     0
                                  0 0.00941 0
                                                        0 0.0101 0.00889
## 2 h0yet8
                     0
                                  0 0.00941 0
                                                        0 0.0101 0.00889
            0
## 3 h0vdi4
                                  0 0.00941 0
                                                        0 0.0101 0.00889
             0
                     0
## 4 h0ycs3
                                                        0 0.0101 0.00889
            0
                     0
                                  0 0.00941 0
## 5 e9pmc9
            0
                     0
                                 0 0.00941 0
                                                        0 0.0101 0.00889
## 6 r4gmv7
             0.00672 0
                                 0 0.00941 0
                                                        0 0.0101 0.00705
## 7 h0yep9
                                 0 0.00941 0
                                                        0 0.0101 0.00889
             0
```

0 0.0101 0.00889

0 0.00941 0.00461

0.00687

```
# Proteins that have VOO caseolap score > 0.05
human_full[which(human_full$V00 > 0.05), ]
## # A tibble: 102 x 9
##
      protein
                IHD
                         CM
                              ARR
                                      VD
                                            CHD
                                                   CCD
                                                          VOO
                                                                 OTH
##
               <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
   1 h7c2e4 0.207 0.0498 0.0497 0.0464 0.0327 0.0376 0.0512 0.0506
##
   2 b7z509 0.0467 0.0562 0.0405 0.0537 0.0404 0.0362 0.0552 0.0679
   3 f8wci6 0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
  4 j3kt25 0.0918 0.0751 0.0731 0.0557 0.0494 0.0464 0.0566 0.0617
## 5 b8zzc5 0.0467 0.0562 0.0405 0.0537 0.0404 0.0362 0.0552 0.0679
## 6 q92839 0.102 0.0943 0.0944 0.0684 0.0663 0.0733 0.0600 0.0846
## 7 q9nzs2 0.105 0.104 0.0729 0.0618 0.0481 0.0484 0.0517 0.0829
## 8 c9j3b7 0.101 0.0954 0.0978 0.0925 0.0890 0.0935 0.0880 0.0959
## 9 e7eqi0 0.107 0.0986 0.0976 0.0676 0.0816 0.0740 0.0578 0.0991
## 10 p09486 0.112 0.111 0.110 0.103 0.105 0.105 0.0988 0.108
## # ... with 92 more rows
# Proteins where VOO has highest caseolap score and also has a caseolap score > 0.05
human_full[which(human_full$IHD < human_full$V00 & human_full$CM < human_full$V00 &
                  human_full$ARR < human_full$V00 & human_full$VD < human_full$V00 &
                  human full$CHD < human full$VOO & human full$CCD < human full$VOO &
                  human_full$OTH < human_full$V00 & human_full$V00 > 0.05), ]
## # A tibble: 12 x 9
                                                             V00
     protein
                   IHD
                           CM
                                 ARR
                                         VD
                                               CHD
                                                      CCD
##
      <chr>
                  <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
                 0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
   1 f8wci6
  2 a0a590ujl0 0.0439 0.0381 0.0389 0.0615 0.0420 0.0306 0.0766 0.0378
##
  3 p02787
                 0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
## 4 p08842
                 0.0439 0.0381 0.0389 0.0615 0.0420 0.0306 0.0766 0.0378
## 5 a0a590ujy9 0.0439 0.0381 0.0389 0.0615 0.0420 0.0306 0.0766 0.0378
## 6 o14656
                 0.0613 0.0562 0.0577 0.0865 0.0702 0.0545 0.104 0.0520
## 7 f8wek9
                 0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
                 0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
## 8 f8wc57
## 9 a0a590ujt4 0.0439 0.0381 0.0389 0.0615 0.0420 0.0306 0.0766 0.0378
## 10 c9jvg0
                 0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
                0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
## 11 c9jb55
## 12 h7c5e8
                0.0553 0.0432 0.0417 0.0561 0.0472 0.0302 0.0665 0.0423
EDA with Z-scores
# Convert caseolap scores into z-scores by column/group
human_standard <- data.frame("protein" = human_full$protein, apply(human_full[2:9], 2, scale))
summary(human standard)
                            THD
                                              CM
                                                               ARR
     protein
```

:-0.7848

1st Qu.:-0.7848

Min.

:-0.5406

1st Qu.:-0.5406

Min.

Length:53145

Class :character

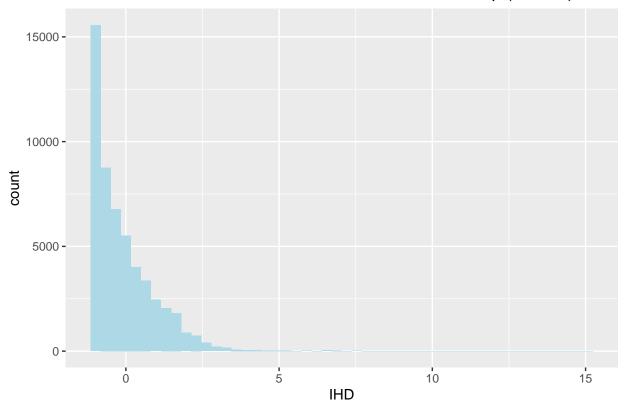
Min.

:-0.8390

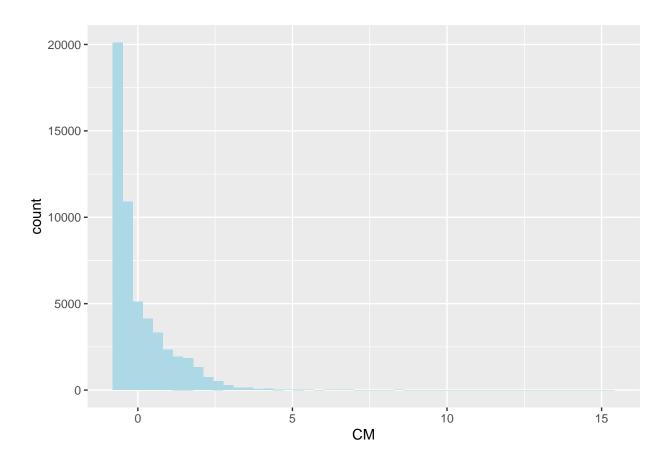
1st Qu.:-0.8390

```
Mode
         :character
                        Median :-0.3189
                                          Median :-0.4474
                                                             Median :-0.5406
                                                 : 0.0000
##
                              : 0.0000
                                                                    : 0.0000
                        Mean
                                          Mean
                                                             Mean
##
                        3rd Qu.: 0.4105
                                          3rd Qu.: 0.4248
                                                             3rd Qu.: 0.1310
##
                               :15.2092
                                          Max.
                                                  :15.1228
                                                             Max.
                                                                     :12.5589
##
          VD
                            CHD
                                              CCD
                                                                 V00
           :-0.5461
                              :-0.7279
##
   Min.
                                         Min.
                                                 :-0.3706
                                                            Min.
                                                                    :-0.3236
                      Min.
    1st Qu.:-0.5461
                      1st Qu.:-0.7279
                                          1st Qu.:-0.3706
                                                            1st Qu.:-0.3236
    Median :-0.5461
                      Median :-0.2948
                                         Median :-0.3706
                                                            Median :-0.3236
##
                              : 0.0000
                                                 : 0.0000
##
    Mean
           : 0.0000
                      Mean
                                         Mean
                                                            Mean
                                                                    : 0.0000
    {\tt 3rd} \ {\tt Qu.:} \ {\tt 0.2440}
##
                      3rd Qu.: 0.3915
                                          3rd Qu.:-0.3706
                                                            3rd Qu.:-0.3236
           :11.2105
                      Max.
                             : 9.6169
                                         Max.
                                                 :13.2787
                                                            Max.
                                                                    :15.0828
         OTH
##
##
  Min.
           :-0.6996
##
   1st Qu.:-0.6996
## Median :-0.3276
##
   Mean
          : 0.0000
##
    3rd Qu.: 0.3447
##
    Max.
           : 9.1216
human_standard[which(human_standard$V00 > 10), ] $protein # proteins with V00 z-score > 10
    [1] "c9j3b7"
                      "p09486"
                                   "o15178"
                                                 "a0a087x1b6" "a0a087wux9"
   [6] "p42768"
                      "a0a590uj10"
##
                                   "p08842"
                                                 "e9peg3"
                                                               "a0a590ujy9"
                                                               "p28072"
## [11] "q04671"
                      "o14656"
                                   "q16831"
                                                 "p10275"
                                                               "q9nzc7"
## [16] "a0a590ujt4" "f5gzg9"
                                   "p19526"
                                                 "o43934"
human standard[which(human standard$IHD < human standard$V00 &
                        human standard$CM < human standard$V00 &
                        human standard$ARR < human standard$V00 &
                        human_standard$VD < human_standard$V00 &
                        human_standard$CHD < human_standard$V00 &
                        human_standard$CCD < human_standard$V00 &
                        human standard$OTH < human standard$VOO &
                        human_standard$V00 > 10), ]$protein
    [1] "c9j3b7"
                      "p09486"
                                   "o15178"
                                                 "a0a087x1b6" "a0a087wux9"
   [6] "p42768"
                      "a0a590uj10"
                                   "p08842"
##
                                                 "e9peg3"
                                                               "a0a590ujy9"
## [11] "q04671"
                      "o14656"
                                   "q16831"
                                                 "p10275"
                                                               "p28072"
## [16] "a0a590ujt4" "f5gzg9"
                                   "o43934"
                                                 "q9nzc7"
# proteins where VOO has highest z-score and VOO > 10 (same as proteins above)
# Histogram of Z-score for each group
ggplot(human_standard, aes(x = IHD)) + geom_histogram(fill = "lightblue", bins = 50) + ggtitle("Distrib
```

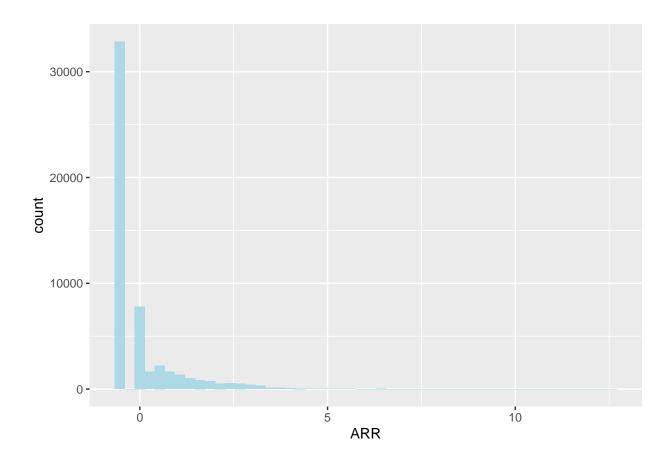
Distribution of CaseOLAP Scores for IHD Disease Group (Human)



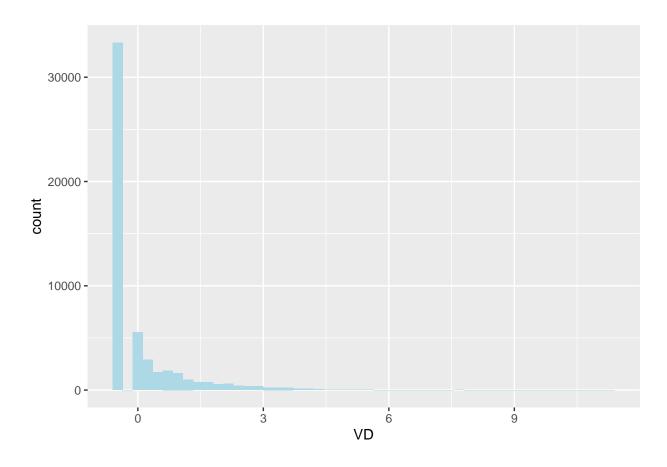
ggplot(human_standard, aes(x = CM)) + geom_histogram(fill = "lightblue", bins = 50)



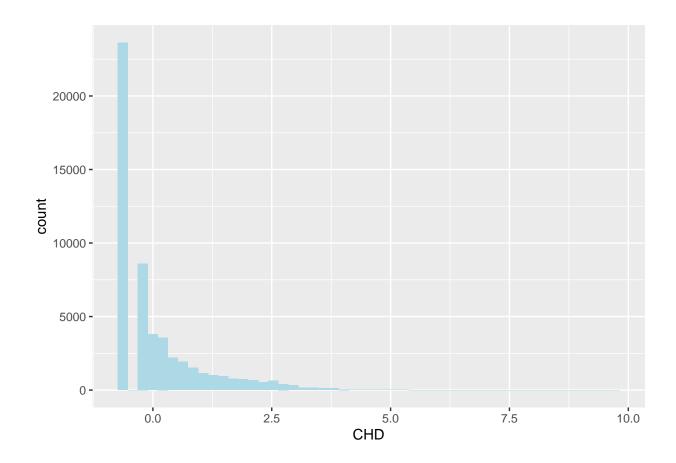
ggplot(human_standard, aes(x = ARR)) + geom_histogram(fill = "lightblue", bins = 50)



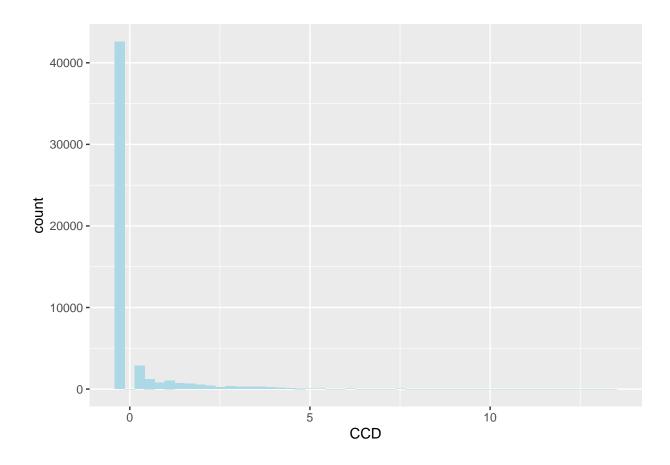
ggplot(human_standard, aes(x = VD)) + geom_histogram(fill = "lightblue", bins = 50)



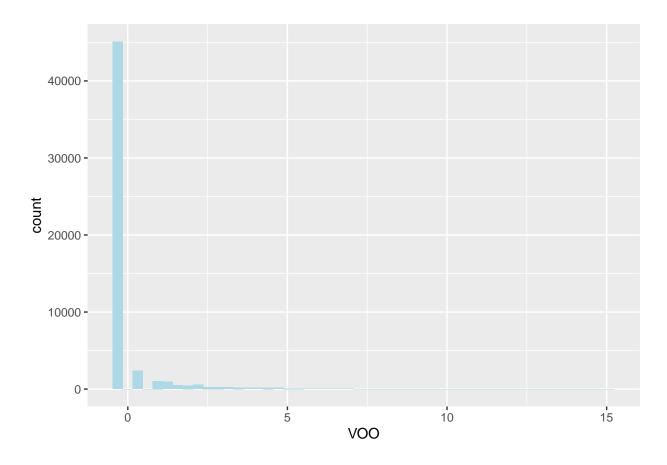
ggplot(human_standard, aes(x = CHD)) + geom_histogram(fill = "lightblue", bins = 50)



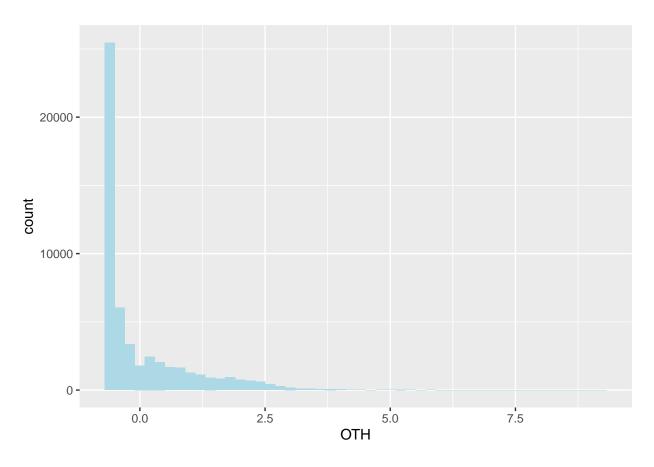
ggplot(human_standard, aes(x = CCD)) + geom_histogram(fill = "lightblue", bins = 50)

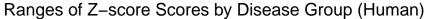


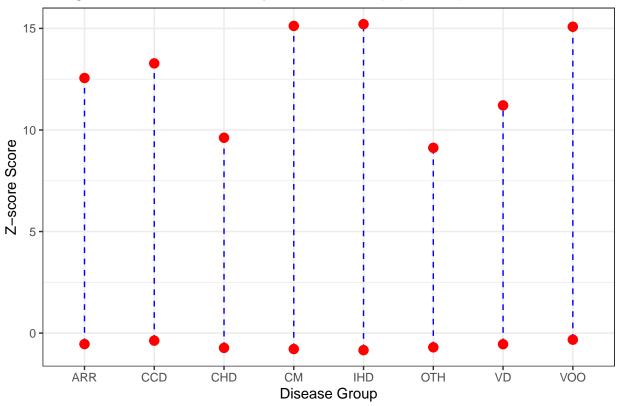
ggplot(human_standard, aes(x = VOO)) + geom_histogram(fill = "lightblue", bins = 50)



ggplot(human_standard, aes(x = OTH)) + geom_histogram(fill = "lightblue", bins = 50)







Finding top unique proteins for each group

Cut-off z-scores are roughly chosen and can be changed to get a smaller or larger list of proteins

IHD

```
human_standard[which(human_standard$V00 < human_standard$IHD &
    human_standard$CM < human_standard$IHD &
    human_standard$ARR < human_standard$IHD &
    human_standard$VD < human_standard$IHD &
    human_standard$CHD < human_standard$IHD &
    human_standard$CCD < human_standard$IHD &
    human_standard$OTH < human_standard$IHD &
    human_standard$IHD > 9), ]
```

```
ARR
                                                  VD
                                                          CHD
                                                                   CCD
                                                                            V00
##
         protein
                      IHD
                                CM
## 719
         h7c2e4 15.20919 3.095237 4.176024 4.371658 2.343464 4.179438 7.012858
         p05154 14.68073 3.108552 3.847722 3.376770 2.015281 3.772437 5.516512
## 5735
## 11679 q9une0 10.97836 5.122472 5.041837 4.349208 2.816573 4.566056 6.446133
## 15709 p27708 15.20896 3.095432 4.176436 4.372216 2.343395 4.179336 7.012695
## 17030 o76075 15.20918 3.095205 4.175984 4.371617 2.343918 4.179399 7.012796
## 17234 h7bzb3 15.20896 3.095432 4.176436 4.372216 2.343395 4.179336 7.012695
```

```
## 23785 q05682 15.19216 3.138532 4.189114 4.367555 2.341986 4.173143 7.001848
## 34447 h7c3z5 15.20896 3.095432 4.176436 4.372216 2.343395 4.179336 7.012695
## 52061 f8vpd4 15.20892 3.095422 4.176424 4.372203 2.343684 4.179325 7.012676
## 719 3.530471
## 5735 3.511839
## 11679 4.534558
## 15709 3.530377
## 17234 3.530377
## 23785 3.533901
## 34447 3.530377
## 52061 3.530366
```

proteins where IHD has highest z-score and is above 9

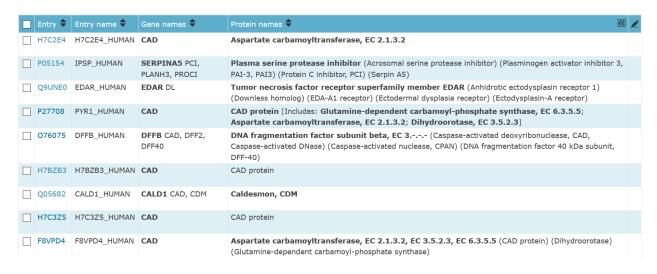


Figure 1: UniProt entries for IHD

\mathbf{CM}

```
human_standard[which(human_standard$IHD < human_standard$CM &
    human_standard$V00 < human_standard$CM &
    human_standard$ARR < human_standard$CM &
    human_standard$VD < human_standard$CM &
    human_standard$CHD < human_standard$CM &
    human_standard$CCD < human_standard$CM &
    human_standard$CTM < human_standard$CM &
    human_standard$CTM < human_standard$CM </pre>
```

```
##
            protein
                         IHD
                                    CM
                                            ARR
                                                      VD
                                                               CHD
                                                                       CCD
## 1577
             j3ksq5 6.689920 8.433404 5.299055 4.165123 2.367500 4.477689
## 8892
             p08603 4.223978 15.122810 6.748300 3.463074 1.740468 5.080118
## 9535
             j3krh5 6.689920 8.433404 5.299055 4.165123 2.367500 4.477689
             q9p121 6.250077 9.891019 6.985538 7.096340 5.093733 5.792587
## 10131
```

```
j3qsc7 6.689920 8.433404 5.299055 4.165123 2.367500 4.477689
## 12897
             j3ks28 6.689920 8.433404 5.299055 4.165123 2.367500 4.477689
## 22950
## 24430
             p12821 6.709497
                              8.432963 5.296883 4.163121 2.378726 4.475182
## 28375
             j3qrx8 6.689920
                              8.433404 5.299055 4.165123 2.367500 4.477689
## 43882
             j3qlr4 6.689920
                              8.433404 5.299055 4.165123 2.367500 4.477689
                              8.433404 5.299055 4.165123 2.367500 4.477689
## 48185
             j3ktb8 6.689920
## 50461
                              8.433404 5.299055 4.165123 2.367500 4.477689
             j3kth9 6.689920
## 52365 a0a0a0msn4 6.689920 8.433404 5.299055 4.165123 2.367500 4.477689
##
              V00
## 1577
         5.461282 5.911577
## 8892
        4.123195 6.193185
## 9535 5.461282 5.911577
## 10131 8.355606 7.740212
## 12897 5.461282 5.911577
## 22950 5.461282 5.911577
## 24430 5.455220 5.911980
## 28375 5.461282 5.911577
## 43882 5.461282 5.911577
## 48185 5.461282 5.911577
## 50461 5.461282 5.911577
## 52365 5.461282 5.911577
```

proteins where CM has highest z-score and above 8

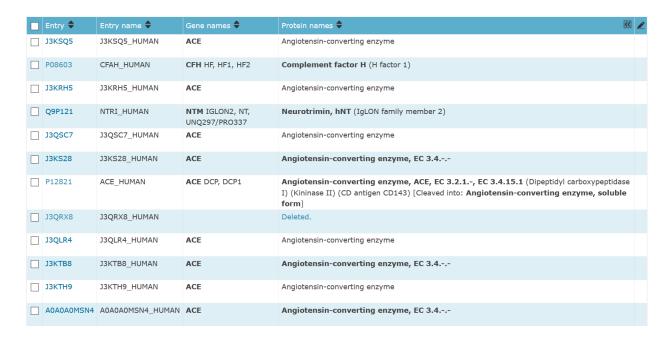


Figure 2: UniProt entries for CM

ARR.

```
human_standard[which(human_standard$IHD < human_standard$ARR & human_standard$CM < human_standard$ARR &
```

```
human_standard$V00 < human_standard$ARR &
                       human_standard$VD < human_standard$ARR &
                       human_standard$CHD < human_standard$ARR &
                       human standard$CCD < human standard$ARR &
                       human_standard$OTH < human_standard$ARR &</pre>
                       human_standard$ARR > 9), ]
##
         protein
                      IHD
                                CM
                                         ARR
                                                   VD
                                                            CHD
                                                                     CCD
                                                                              V00
          q9u149 2.657266 2.916266 12.558886 3.678617 2.330739 4.846638 4.011663
## 7992
## 11723 e5rk80 7.621587 6.884133 9.632561 4.705597 2.892766 8.135945 6.506734
## 12731 q16473 3.520232 2.221996 9.694233 3.821210 2.246642 2.323893 4.002783
## 21661 o43593 7.621587 6.884133 9.632561 4.705597 2.892766 8.135945 6.506734
## 42437 p49366 3.616542 3.270556 10.563750 4.467255 4.766417 4.979301 4.554361
## 7992 2.500736
## 11723 5.396820
## 12731 2.032001
## 21661 5.396820
## 42437 3.149157
# proteins where ARR has highest z-score and above 9
```

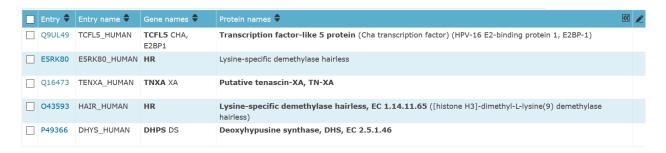


Figure 3: UniProt entries for ARR

VD

```
human_standard[which(human_standard$IHD < human_standard$VD &
                       human_standard$CM < human_standard$VD &
                       human_standard$ARR < human_standard$VD &
                       human_standard$VOO < human_standard$VD &
                       human_standard$CHD < human_standard$VD &
                       human_standard$CCD < human_standard$VD &
                       human_standard$OTH < human_standard$VD &
                       human standard$VD > 8), ]
                                       ARR
                                                   VD
                                                           CHD
                                                                    CCD
                                                                             V00
##
         protein
                     IHD
                               CM
## 19024 p25116 4.65126 6.172324 5.373991 11.183498 6.112869 4.872527 8.671207
## 51911 q6e213 1.94605 2.162937 2.279152 8.399987 2.475388 2.115031 4.872195
##
              ОТН
## 19024 6.166133
## 51911 2.119385
```



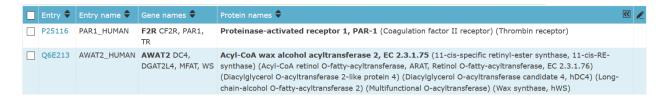


Figure 4: UniProt entries for VD

CHD

```
human standard[which(human standard$IHD < human standard$CHD &
                          human_standard$CM < human_standard$CHD &
                          human standard$ARR < human standard$CHD &
                          human_standard$VD < human_standard$CHD &
                          human_standard$V00 < human_standard$CHD &
                          human_standard$CCD < human_standard$CHD &</pre>
                          human_standard$OTH < human_standard$CHD &
                          human_standard$VD > 5), ]
##
        protein
                       IHD
                                   CM
                                            ARR
                                                       VD
                                                                CHD
                                                                          CCD
                                                                                     V00
## 8993 q8iwt0 2.477818 2.240472 2.962209 5.413161 8.447828 3.523173 7.904877
## 8993 2.795316
# proteins where CHD has highest z-score and above 5
                               Protein names 🗣
                                                                                                 ((
☐ Entry 		 Entry name 		 Gene names 		 ☐
Q8IWTO ARCH_HUMAN ZBTB8OS ARCH Protein archease (Protein ZBTB8OS) (Zinc finger and BTB domain-containing opposite strand protein 8)
```

Figure 5: UniProt entries for CHD

CCD

```
human_standard[which(human_standard$IHD < human_standard$CCD &
    human_standard$CM < human_standard$CCD &
    human_standard$ARR < human_standard$CCD &
    human_standard$VD < human_standard$CCD &
    human_standard$CCD < human_standard$CCD &
    human_standard$VOO < human_standard$CCD &
    human_standard$VOO < human_standard$CCD &
    human_standard$CCD > 10), ]
```

```
##
                                            ARR
                                                              CHD
                                                                       CCD
            protein
             p42357 4.177873 4.640655 8.527665 5.119573 5.323045 12.05445
## 223
## 1760
             q96s42 1.695108 1.970701 7.093345 2.570365 3.404003 11.81856
## 6798
             h7c0e4 1.695108 1.970701 7.093345 2.570365 3.404003 11.81856
## 8283
             q8ng44 3.938835 5.019702 10.210906 5.263583 5.089687 12.96113
## 9231
             e9pg18 1.409237 2.188305 6.630038 2.282354 3.954432 10.72187
## 11561
             a3ey21 1.403318 2.185107
                                      6.625567 2.289853 3.952090 10.71290
## 16928
             q12809 1.451550 1.723750 8.080234 1.846309 5.914939 12.77803
## 19259
             q96hu1 3.962873 3.884718
                                       8.757496 3.950484 3.665883 10.29203
## 27097
             h9kvd2 1.409237 2.188305 6.630038 2.282354 3.954432 10.72187
## 35707
             q8ng42 3.938835 5.019702 10.210906 5.263583 5.089687 12.96113
## 38780
             k4dia1 1.409237 2.188305
                                      6.630038 2.282354 3.954432 10.72187
## 39034
             e9phb6 1.409237 2.188305 6.630038 2.282354 3.954432 10.72187
## 42468 a0a0a0mt39 1.409237 2.188305 6.630038 2.282354 3.954432 10.72187
## 44654
             q14524 1.403796 2.181298 6.642634 2.279847 3.964270 10.75395
## 45337
             q8wxs4 3.930572 5.010012 10.217844 5.265819 5.091058 12.97247
## 47772
             q15477 6.862250 7.131732 9.438035 6.730224 6.217419 10.02837
## 49418
             q8ng45 3.938835 5.019702 10.210906 5.263583 5.089687 12.96113
## 49754
             p19526 8.531811 8.582576 10.084570 8.708805 8.416007 11.93331
               V00
## 223
         5.402255 5.152783
## 1760
         2.411202 2.133770
## 6798
         2.411202 2.133770
## 8283
         5.990651 5.086934
## 9231
         2.204544 2.974921
## 11561 2.205546 2.973325
## 16928 2.010776 2.256843
## 19259 5.077978 3.867956
## 27097 2.204544 2.974921
## 35707 5.990651 5.086934
## 38780 2.204544 2.974921
## 39034
        2.204544 2.974921
## 42468 2.204544 2.974921
## 44654 2.202302 2.972967
## 45337 5.997930 5.080532
## 47772 7.437046 6.646555
## 49418 5.990651 5.086934
## 49754 10.609381 8.836096
```

proteins where CCD has highest z-score and above 10

VOO

```
human_standard[which(human_standard$IHD < human_standard$V00 & human_standard$CM < human_standard$V00 & human_standard$ARR < human_standard$V00 & human_standard$VD < human_standard$V00 & human_standard$CHD < human_standard$V00 & human_standard$CCD < human_standard$V00 & human_stand
```

Entry 🕏	Entry name 🕏	Gene names 🕏	Protein names	
P42357	HUTH_HUMAN	HAL HIS	Histidine ammonia-lyase, Histidase, EC 4.3.1.3	
Q96S42	NODAL_HUMAN	NODAL	Nodal homolog	
H7C0E4	H7C0E4_HUMAN	NODAL	Nodal homolog	
Q8NG44	Q8NG44_HUMAN	PGR PR, hCG_39657	Nuclear receptor subfamily 3 group C member 3 (Progesterone receptor)	
E9PG18	E9PG18_HUMAN	SCN5A	Sodium channel protein	
A3EY21	A3EY21_HUMAN	SCN5A	Cardiac sodium channel alpha subunit (Sodium channel protein type 5 subunit alpha)	
Q12809	KCNH2_HUMAN	KCNH2 ERG, ERG1, HERG	Potassium voltage-gated channel subfamily H member 2 (Eag homolog) (Ether-a-go-go-related gene potassium channel 1, ERG-1, Eag-related protein 1, Ether-a-go-go-related protein 1, H-ERG, hERG-1, hERG-1) (Voltage-gated potassium channel subunit Kv11.1)	
Q96HU1	SGSM3_HUMAN	SGSM3 MAP, RABGAPLP, RUTBC3	Small G protein signaling modulator 3 (Merlin-associated protein) (RUN and TBC1 domain-containing protein 3) (Rab-GTPase-activating protein-like protein, RabGAPLP)	
H9KVD2	H9KVD2_HUMAN	SCN5A	Sodium channel protein	
Q8NG42	Q8NG42_HUMAN	PGR PR, hCG_39657	Nuclear receptor subfamily 3 group C member 3 (Progesterone receptor)	
K4DIA1	K4DIA1_HUMAN	SCN5A	Sodium channel protein	
Е9РНВ6	E9PHB6_HUMAN	SCN5A	Sodium channel protein	
A0A0A0MT39	A0A0A0MT39_HUMAN	SCN5A	Sodium channel protein	
Q14524	SCN5A_HUMAN	SCN5A	Sodium channel protein type 5 subunit alpha (Sodium channel protein cardiac muscle subunit alpha) (Sodium channel protein type V subunit alpha) (Voltage-gated sodium channel subunit alpha Nav1.5) (hH1)	
Q8WXS4	CCGL_HUMAN	TMEM37 PR	Voltage-dependent calcium channel gamma-like subunit (Neuronal voltage-gated calcium channel gamma-like subunit) (Transmembrane protein 37)	
Q15477	SKIV2_HUMAN	SKIV2L DDX13, SKI2W, SKIV2, W	Helicase SKI2W, Ski2, EC 3.6.4 (Helicase-like protein, HLP)	
Q8NG45	Q8NG45_HUMAN	PGR PR, hCG_39657	Nuclear receptor subfamily 3 group C member 3 (Progesterone receptor)	
P19526	FUT1_HUMAN	FUT1 H, HSC	Galactoside alpha-(1,2)-fucosyltransferase 1 (Alpha(1,2)FT 1) (Blood group H alpha 2-fucosyltransferase) (Fucosyltransferase 1) (GDP-L-fucose:beta- D-galactoside 2-alpha-1-fucosyltransferase 1) (Type 1 galactoside alpha-(1,2)-fucosyltransferase FUTI, EC 2.4.1.69) (Type 2 galactoside alpha-(1,2)- fucosyltransferase FUTI, EC 2.4.1.344)	

Figure 6: UniProt entries for CCD

```
##
            protein
                         IHD
                                    CM
                                             ARR
                                                        VD
                                                                 CHD
                                                                           CCD
             c9j3b7 6.965302 6.641857
##
  3063
                                        8.738036
                                                  9.254790 7.629177 10.947898
##
  5006
             p09486 7.814915 7.872700
                                        9.890282 10.348461 9.123827 12.285759
##
  5877
             015178 8.643149 8.908017 10.663996 10.596955 9.616940 13.278656
         a0a087x1b6 4.977847 6.024066
                                        5.630716 11.208309 5.043599
## 10792 a0a087wux9 4.977847 6.024066
                                        5.630716 11.208309 5.043599
                                                                      5.269674
  13447
             p42768 6.965302 6.641857
                                        8.738036
                                                  9.254790 7.629177 10.947898
## 15108 a0a590ujl0 2.559614 2.182201
                                        3.147555
                                                  5.969290 3.213214
                                                                      3.335805
## 18427
             p08842 2.559549 2.182144
                                        3.147484
                                                  5.969165 3.217474
                                                                      3.335734
  20344
##
             e9peg3 4.977847 6.024066
                                        5.630716 11.208309 5.043599
                                                                      5.269674
## 20517 a0a590ujy9 2.559614 2.182201
                                        3.147555
                                                  5.969290 3.213214
                                                                      3.335805
## 24905
             q04671 8.231804 8.066166 10.062439 10.924957 8.722026 12.356011
## 26564
             014656 3.906485 3.591231
                                        4.932987
                                                  8.620294 5.861550
                                                                      6.229122
## 27149
             q16831 7.027328 6.504890
                                        8.550979
                                                  8.298618 6.353187
                                                                      9.357606
## 36256
             p10275 4.977663 6.023832
                                        5.630504 11.210487 5.043400
                                                                      5.269480
## 38781
             p28072 7.460803 7.044626
                                                  8.314015 7.943831
                                        8.885437
                                                                      9.371391
## 42793 a0a590ujt4 2.559614 2.182201
                                        3.147555
                                                  5.969290 3.213214
                                                                      3.335805
## 45683
             f5gzg9 4.977847 6.024066
                                        5.630716 11.208309 5.043599
                                                                      5.269674
## 51633
             043934 7.274412 7.321452
                                        8.572355
                                                  8.072049 7.307056
                                                                      8.940106
## 52185
             q9nzc7 7.112592 6.932865
                                        8.928574
                                                  9.204862 8.002171 10.727447
##
              000
                       OTH
  3063
         12.27602 7.325668
  5006
         13.82318 8.338084
         13.30115 9.121595
  6661
         14.23471 5.771785
  10792 14.23471 5.771785
## 13447 12.27602 7.325668
## 15108 10.64255 2.459249
## 18427 10.64234 2.459189
```

```
## 20344 14.23471 5.771785

## 20517 10.64255 2.459249

## 24905 15.08283 8.576291

## 26564 14.52802 3.652153

## 27149 10.90972 6.381701

## 36256 14.23421 5.771562

## 38781 10.12635 7.120730

## 42793 10.64255 2.459249

## 45683 14.23471 5.771785

## 51633 10.17515 7.377648

## 52185 12.34425 7.329424
```

Entry 🗢	Entry name 🕏	Gene names 🗢	Protein names ♦	«
C9J3B7	C9J3B7_HUMAN	WAS	Wiskott-Aldrich syndrome protein	
P09486	SPRC_HUMAN	SPARC ON	SPARC (Basement-membrane protein 40, BM-40) (Osteonectin, ON) (Secreted protein acidic and rich i cysteine)	in
015178	TBXT_HUMAN	ТВХТ Т	T-box transcription factor T (Brachyury protein) (Protein T)	
A0A087X1B6	A0A087X1B6_HUMAN	AR	Androgen receptor (Dihydrotestosterone receptor) (Nuclear receptor subfamily 3 group C member 4))
A0A087WUX9	A0A087WUX9_HUMAN	AR	Androgen receptor	
P42768	WASP_HUMAN	WAS IMD2	Wiskott-Aldrich syndrome protein, WASp	
A0A590UJL0	A0A590UJL0_HUMAN	STS	Steryl-sulfatase	
P08842	STS_HUMAN	STS ARSC1	Steryl-sulfatase, EC 3.1.6.2 (Aryisulfatase C, ASC) (Estrone sulfatase) (Steroid sulfatase) (Steryl-sulfate sulfohydrolase)	
E9PEG3	E9PEG3_HUMAN	AR	Androgen receptor	
A0A590UJY9	A0A590UJY9_HUMAN	STS	Steryl-sulfatase	

Figure 7: UniProt entries for VOO

OTH

```
human_standard[which(human_standard$IHD < human_standard$OTH &</pre>
                         human_standard$CM < human_standard$OTH &</pre>
                         human_standard$ARR < human_standard$OTH &</pre>
                         human_standard$VD < human_standard$OTH &</pre>
                         human_standard$CHD < human_standard$OTH &</pre>
                         human_standard$CCD < human_standard$OTH &</pre>
                         human_standard$V00 < human_standard$OTH &</pre>
                         human_standard$OTH > 7), ]
                                                                                   V00
                                           ARR
                                                      VD
                                                               CHD
                                                                         CCD
         protein
                        IHD
                                   CM
## 25902 p03950 4.081178 5.296124 4.070665 4.146777 2.871126 4.417061 5.367782
##
               OTH
## 25902 7.288494
# proteins where OTH has highest z-score and above 7
```



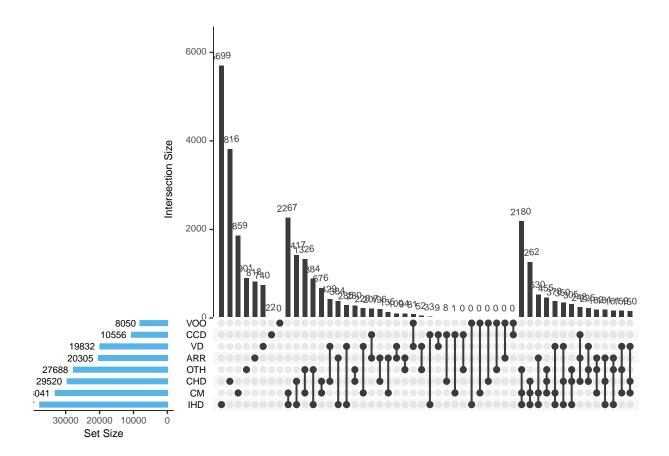
Figure 8: UniProt entries for OTH

UpSet Plots

```
library(UpSetR)
## Warning: package 'UpSetR' was built under R version 4.0.5
# http://qehlenborglab.org/research/projects/upsetr/
# Create dataframe with 8 columns corresponding to the 8 CVD groups
# 1 if protein is above threshold, 0 if not
# Threshold 0
human_binary <- ifelse(human_full[ , 2:9] > 0, 1, 0)
human_binary <- data.frame("protein" = human_full$protein, human_binary)</pre>
# Threshold 0.01
human_binary_01 \leftarrow ifelse(human_full[, 2:9] > 0.01, 1, 0)
human_binary_01 <- data.frame("protein" = human_full$protein, human_binary_01)
# Threshold 0.02
human_binary_02 <- ifelse(human_full[ , 2:9] > 0.02, 1, 0)
human_binary_02 <- data.frame("protein" = human_full$protein, human_binary_02)
# Threshold 0.03
human_binary_03 <- ifelse(human_full[ , 2:9] > 0.03, 1, 0)
human_binary_03 <- data.frame("protein" = human_full$protein, human_binary_03)
# Threshold 0.05
human_binary_05 <- ifelse(human_full[ , 2:9] > 0.05, 1, 0)
human_binary_05 <- data.frame("protein" = human_full$protein, human_binary_05)
```

UpSet Plot with 50 Intersections

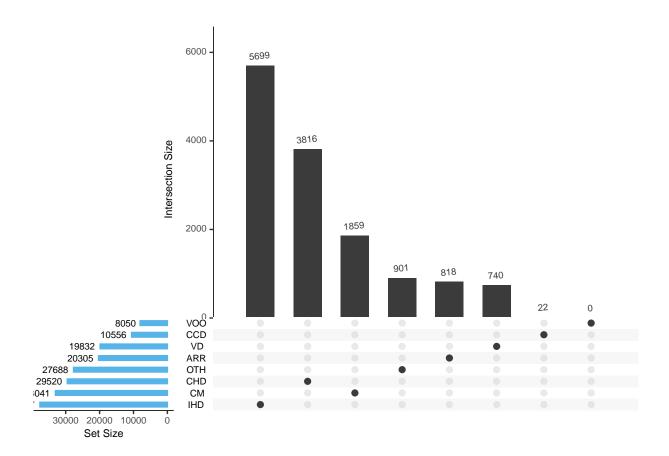
```
upset(human_binary,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "V00", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1, 1, 1, 1, 1, 1.1),
    set_size.show = TRUE,
    empty.intersections = "on",
    nintersects = 50)
```



Single Disease Groups (No intersections)

```
upset(human_binary,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "VOO", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1, 1, 1, 1, 1, 1, 1),
    set_size.show = TRUE,
    empty.intersections = "on",
    nintersects = 8)
```

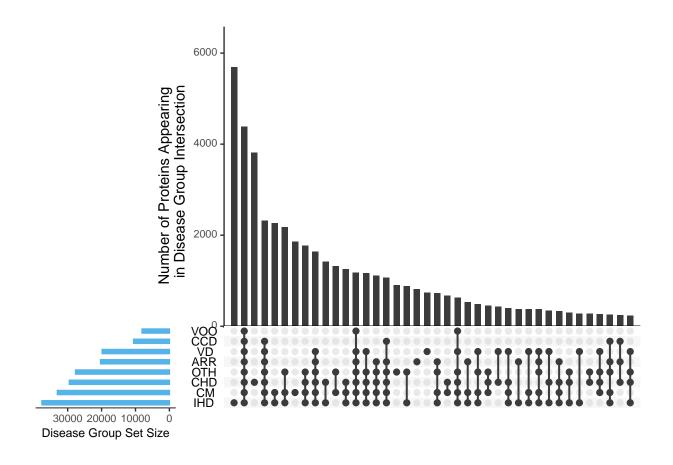
geom_path: Each group consists of only one observation. Do you need to adjust
the group aesthetic?



Threshold of 0 UpSet Plot

```
upset(human_binary,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "V00", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1.3, 1.2, 1.1, 1.1, 1.25, 1.1),
    order.by = "freq",
    show.numbers = FALSE,
    mb.ratio = c(0.72, 0.28),
    empty.intersections = "on",
    mainbar.y.label = "Number of Proteins Appearing \n in Disease Group Intersection",
    sets.x.label = "Disease Group Set Size")
```

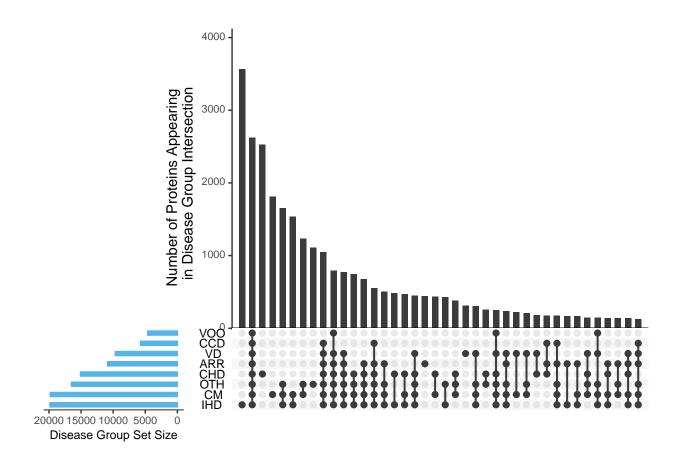
Warning in Make_base_plot(Main_bar_plot = x\$Main_bar, Matrix_plot = x\$Matrix, :
Plot might be out of range if ratio > 0.7 or < 0.3</pre>



Threshold of 0.01 UpSet Plot

```
upset(human_binary_01,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "V00", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1.3, 1.2, 1.1, 1.1, 1.25, 1.1),
    order.by = "freq",
    show.numbers = FALSE,
    mb.ratio = c(0.72, 0.28),
    empty.intersections = "on",
    mainbar.y.label = "Number of Proteins Appearing \n in Disease Group Intersection",
    sets.x.label = "Disease Group Set Size")
```

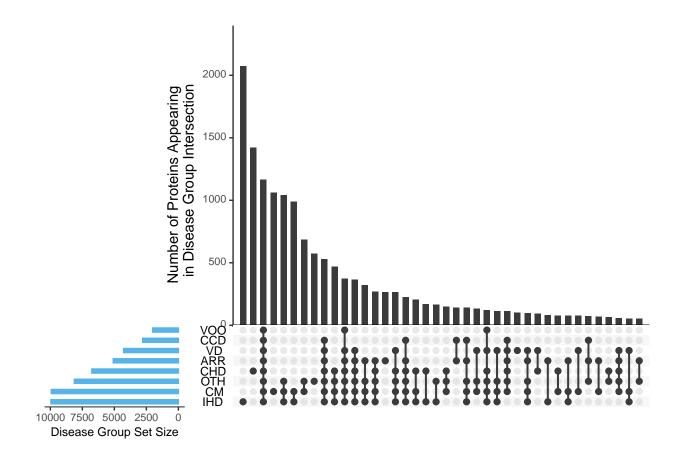
Warning in Make_base_plot(Main_bar_plot = x\$Main_bar, Matrix_plot = x\$Matrix, :
Plot might be out of range if ratio > 0.7 or < 0.3</pre>



Threshold of 0.02 UpSet Plot

```
upset(human_binary_02,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "V00", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1.3, 1.2, 1.1, 1.1, 1.25, 1.1),
    order.by = "freq",
    show.numbers = FALSE,
    mb.ratio = c(0.72, 0.28),
    empty.intersections = "on",
    mainbar.y.label = "Number of Proteins Appearing \n in Disease Group Intersection",
    sets.x.label = "Disease Group Set Size")
```

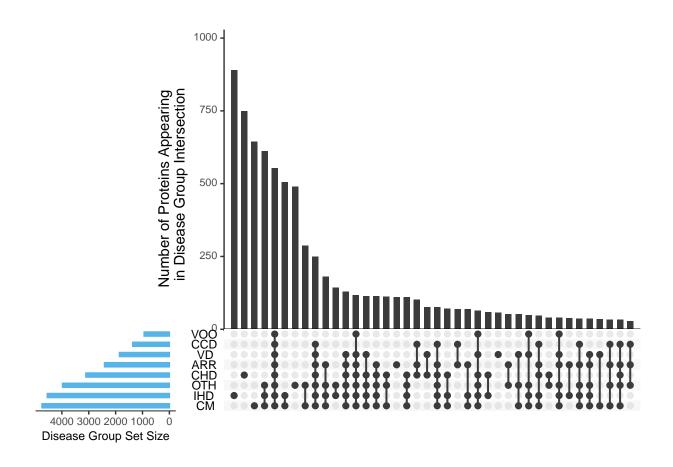
```
## Warning in Make_base_plot(Main_bar_plot = x$Main_bar, Matrix_plot = x$Matrix, :
## Plot might be out of range if ratio > 0.7 or < 0.3</pre>
```



Threshold of 0.03 UpSet Plot

```
upset(human_binary_03,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "V00", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1.3, 1.2, 1.1, 1.1, 1.25, 1.1),
    order.by = "freq",
    show.numbers = FALSE,
    mb.ratio = c(0.72, 0.28),
    empty.intersections = "on",
    mainbar.y.label = "Number of Proteins Appearing \n in Disease Group Intersection",
    sets.x.label = "Disease Group Set Size")
```

```
## Warning in Make_base_plot(Main_bar_plot = x$Main_bar, Matrix_plot = x$Matrix, :
## Plot might be out of range if ratio > 0.7 or < 0.3</pre>
```



Threshold of 0.05 UpSet Plot

```
upset(human_binary_05,
    sets = c("IHD", "CM", "ARR", "VD", "CHD", "CCD", "V00", "OTH"),
    sets.bar.color = "#56B4E9",
    number.angles = 5,
    # c(intersection size title, intersection size tick labels, set size title, set size tick labels,
    text.scale = c(1.3, 1.2, 1.1, 1.1, 1.25, 1.1),
    order.by = "freq",
    show.numbers = FALSE,
    mb.ratio = c(0.72, 0.28),
    empty.intersections = "on",
    mainbar.y.label = "Number of Proteins Appearing \n in Disease Group Intersection",
    sets.x.label = "Disease Group Set Size")
```

```
## Warning in Make_base_plot(Main_bar_plot = x$Main_bar, Matrix_plot = x$Matrix, :
## Plot might be out of range if ratio > 0.7 or < 0.3</pre>
```

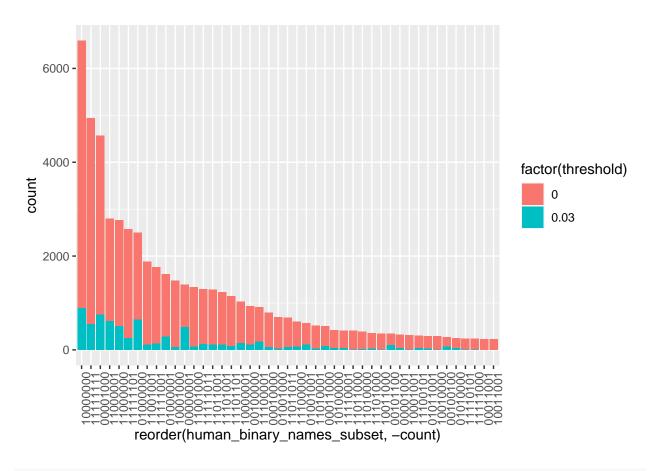
```
Number of Proteins Appearing in Disease Group Set Size
```

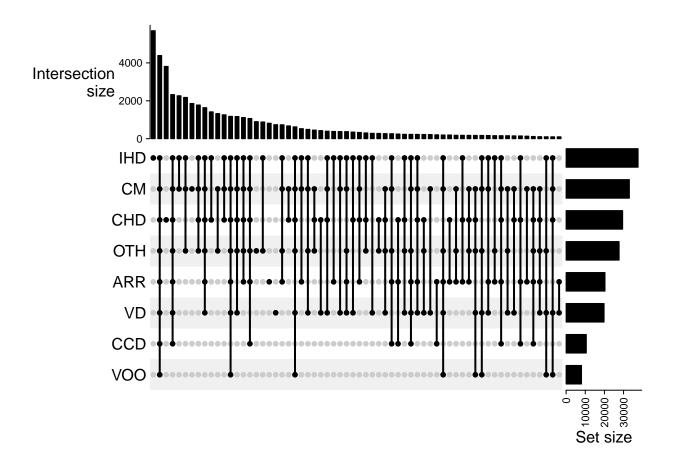
```
# library(devtools)
# install_github("jokergoo/ComplexHeatmap")
# Refer to https://jokergoo.github.io/ComplexHeatmap-reference/book/upset-plot.html#example-with-the-mo
# For Threshold O dataframe
# Make binary matrix
human binary mat <- ComplexHeatmap::make comb mat(human binary)
# Get size for each intersection
human_binary_comb_size <- sort(ComplexHeatmap::comb_size(human_binary_mat), decreasing = TRUE)
# Get size for each category set
human_binary_set_size <- ComplexHeatmap::set_size(human_binary_mat)</pre>
# For Threshold 0.03 dataframe
# Make binary matrix
human_binary_mat_03 <- ComplexHeatmap::make_comb_mat(human_binary_03)
# Get size for each intersection
human_binary_comb_size_03 <- sort(ComplexHeatmap::comb_size(human_binary_mat_03), decreasing = TRUE)
# Get size for each category set
human_binary_set_size_03 <- ComplexHeatmap::set_size(human_binary_mat_03)
\# Get intersections with intersection size > 200 in the Threshold 0 dataframe
human_binary_names_subset <- names(human_binary_comb_size[human_binary_comb_size > 200])
# Find the size of those intersections in the Threshold 0.03 dataframe
human_binary_comb_size_03[human_binary_names_subset]
```

```
750
                                 505
                                               644
##
      891
             554
                          249
                                        613
                                                      110
##
      129
             59
                   287
                           72
                                 118
                                        115
                                               114
                                                       76
 ##
##
      490
             143
                   111
                           58
                                 181
                                         24
                                                64
                                                       69
## 11010001 01001001 00011000 11011000 10100000 11010000 11110001 10011000
                    77
                           10
                                  39
                                                37
                                                       2
      24
             112
                                         12
## 11101000 10001001 10010000 00001001 01011001 11100101 00101100
                                                     <NA>
##
      28
             10
                     7
                           40
                                  26
                                         37
                                               102
                                                       NA
                   <NA> 01010000 00100100
## 11110101 11111000
##
       7
              7
                    NA
                           36
                                  69
```

Stacked Barplot comparing threshold 0 and threshold 0.03

Warning: Removed 2 rows containing missing values (position_stack).





Stacked UpSet Plot comparing threshold 0 and threshold 0.03

```
# Setting up dataframe
human_binary_TF <- human_binary</pre>
human_binary_TF[2:9] <- human_binary[2:9] == 1</pre>
human_binary_TF["Threshold"] <- '0'</pre>
human_binary_03_TF <- human_binary_03</pre>
human_binary_03_TF[2:9] <- human_binary_03[2:9] == 1</pre>
human_binary_03_TF["Threshold"] <- '0.03'</pre>
human_binary_double_TF <- rbind(human_binary_TF, human_binary_03_TF)</pre>
CVD_groups <- colnames(human_binary)[2:9]</pre>
# Upset plot
library(ComplexUpset)
##
## Attaching package: 'ComplexUpset'
## The following object is masked from 'package:UpSetR':
##
##
       upset
```

```
upset(
  human_binary_double_TF,
  CVD_groups,
  base_annotations = list(
    'Number of Proteins Appearing \n in Disease Group Intersection' = intersection_size(
      counts = FALSE,
      mapping = aes(fill = Threshold)
    ) + scale fill manual(values=c(
            '0'='#E41A1C', '0.03'='#377EB8'))
  ),
  width_ratio = 0.15,
  n_{intersections} = 40,
  max_size = 12000,
  set_sizes=(
        upset_set_size(geom=geom_bar(
                aes(x=group),
                width=0.8),
                position = 'right')
        + theme(axis.text.x=element_text(angle=90))
        + ylab('Disease Group\n Set Size')),
   guides='over',
  name=''
)
```

