# HLA typing: whole exomes

# Clemens Messerschmidt 21.09.2015

For 12 panels, which were used in the HLAssign paper and have known HLA types, we performed HLA typing with the tools optitype, bwakit, hlassign.

The following table shows the reference types and the optitype predictions with 4-digit resolution:

#### print(all\_alleles)

```
۷6
##
               V2
                          VЗ
                                      ٧4
                                                 ۷5
## CELL ID 108 "nottyped"
                          "nottyped"
                                      "nottyped"
                                                 "nottyped"
                                                             "nottyped"
## CELL_ID_109 "A*24:03"
                          "A*33:03"
                                      "B*15:12"
                                                 "B*46:01"
                                                             "C*01:02"
                                      "B*15:01"
## CELL_ID_122 "A*02:01"
                          "A*24:23"
                                                 "nottyped" "C*03:03"
                                                             "C*03:04"
## CELL_ID_13
               "A*02:05"
                          "A*32:01"
                                      "B*40:01"
                                                 "B*49:01"
## CELL ID 16
               "A*11:01"
                          "A*24:03"
                                      "B*15:02"
                                                 "B*55:02"
                                                             "nottyped"
## CELL_ID_163 "nottyped" "nottyped" "B*07:02"
                                                 "B*44:17"
                                                             "nottyped"
## CELL ID 165 "nottyped"
                          "nottyped"
                                     "B*35:31"
                                                 "nottyped" "nottyped"
## CELL ID 18
                                      "B*15:01"
                                                             "C*03:04"
               "A*02:01"
                          "A*32:01"
                                                 "B*27:08"
## CELL ID 21
               "nottyped" "nottyped" "nottyped"
                                                 "nottyped" "nottyped"
## CELL ID 235 "A*02:01"
                          "A*31:01"
                                      "B*44:02"
                                                 "B*51:01"
                                                             "C*14:02"
                                                            "C*07:04"
## CELL ID 36
               "A*24:10"
                          "A*29:01"
                                      "B*07:05"
                                                 "B*51:01"
## CELL ID 38
               "A*30:02"
                          "A*66:02"
                                      "B*18:01"
                                                 "B*58:01"
                                                             "C*07:01"
## CELL ID 39
                                      "B*58:01"
                                                             "C*03:02"
               "A*01:02"
                          "A*66:01"
                                                 "B*58:02"
## CELL ID 41
               "A*11:01"
                          "A*26:01"
                                      "B*07:05"
                                                 "B*55:02"
                                                             "C*01:02"
                                                             "C*04:01"
## CELL_ID_45
               "A*02:01"
                          "A*33:03"
                                      "B*15:16"
                                                 "B*44:03"
## CELL_ID_56
               "A*02:11"
                          "A*68:01"
                                      "B*35:05"
                                                 "B*40:04"
                                                             "C*03:04"
                                      "B*15:10"
## CELL ID 6
               "A*03:01"
                          "A*30:01"
                                                 "B*58:01"
                                                             "C*07:18"
## CELL ID 79
               "A*24:02"
                          "A*24:02"
                                      "nottyped" "nottyped" "nottyped"
## CELL_ID_94
               "A*02:01"
                          "A*24:02"
                                      "B*51:01"
                                                 "B*54:01"
                                                             "C*01:02"
## CELL_ID_99
               "A*03:01"
                          "A*03:01"
                                      "B*47:01"
                                                 "B*47:01"
                                                             "C*06:02"
##
## CELL_ID_108 "nottyped" "A*03:01" "A*31:01" "B*15:18" "B*35:03" "C*04:01"
## CELL ID 109 "nottyped" "A*24:03" "A*33:03" "B*15:12" "B*46:01" "C*01:02"
                          "A*02:01" "A*24:23" "B*15:01" "B*51:01" "C*03:03"
## CELL ID 122 "C*03:04"
## CELL ID 13
               "C*07:01"
                          "A*02:05" "A*32:01" "B*40:01" "B*49:01" "C*03:04"
## CELL ID 16
               "C*12:03"
                          "A*24:02" "A*25:01" "B*18:01" "B*51:09" "C*01:02"
## CELL ID 163 "nottyped" "A*03:01" "A*32:01" "B*07:02" "B*44:02" "C*05:01"
## CELL ID 165 "C*12:04"
                           "A*02:01" "A*02:01" "B*35:31" "B*57:01" "C*02:02"
                          "A*02:01" "A*32:01" "B*15:01" "B*27:08" "C*03:04"
## CELL ID 18
               "C*06:02"
               "nottyped" "A*02:01" "A*02:01" "B*44:02" "B*51:01" "C*07:04"
## CELL ID 21
## CELL_ID_235 "C*16:04"
                          "A*02:01" "A*31:01" "B*44:02" "B*51:01" "C*14:02"
## CELL_ID_36
               "C*15:05"
                          "A*24:10" "A*29:01" "B*07:05" "B*51:01" "C*07:04"
                          "A*03:01" "A*11:01" "B*07:02" "B*51:01" "C*07:02"
## CELL_ID_38
               "C*07:01"
## CELL_ID_39
               "C*06:02"
                          "A*01:02" "A*66:01" "B*58:01" "B*58:01" "C*03:02"
## CELL ID 41
               "C*07:02"
                          "A*11:01" "A*26:01" "B*07:05" "B*55:02" "C*01:02"
                          "A*02:01" "A*33:03" "B*15:16" "B*44:03" "C*04:01"
## CELL_ID_45
               "C*14:02"
## CELL_ID_56
               "C*04:01"
                          "A*02:11" "A*68:01" "B*35:05" "B*40:04" "C*03:04"
                          "A*03:01" "A*30:01" "B*15:10" "B*58:01" "C*07:01"
## CELL_ID_6
               "C*08:04"
## CELL_ID_79
               "nottyped" "A*24:02" "A*24:02" "B*52:01" "B*52:01" "C*12:02"
```

```
## CELL_ID_94 "C*14:02" "A*01:01" "A*24:02" "B*08:01" "B*44:06" "C*05:01"
             "C*06:02" "A*03:01" "A*03:01" "B*47:01" "B*47:01" "C*06:02"
## CELL ID 99
                        V2
                                   V3
                                             ۷4
## CELL_ID_108 "C*07:04" "A*03:205" "A*31:21" "B*15:18"
                                                        "B*35:03" "C*04:01"
## CELL ID 109 "C*03:03" "A*24:03" "A*33:03" "B*15:12" "B*46:01" "C*01:51"
## CELL_ID_122 "C*03:04" "A*02:01" "A*24:23" "B*15:01" "B*51:01" "C*03:03"
## CELL ID 13 "C*07:01" "A*02:05" "A*32:53" "B*40:221" "B*49:01" "C*03:04"
## CELL ID 16 "C*12:03" "A*24:02"
                                   "A*25:01" "B*18:01" "B*51:09" "C*01:02"
## CELL ID 163 "C*07:02" "A*03:01"
                                   "A*32:01" "B*07:02" "B*44:17" "C*05:01"
## CELL_ID_165 "C*06:02" "A*02:01"
                                   "A*02:01" "B*35:31" "B*57:01" "C*02:02"
## CELL_ID_18 "C*06:02" "A*02:01"
                                   "A*32:01" "B*15:01" "B*27:08" "C*03:04"
## CELL_ID_21 "C*14:02" "A*02:01"
                                   "A*02:01" "B*44:02" "B*51:01" "C*07:04"
## CELL_ID_235 "C*16:04" "A*02:01"
                                   "A*31:01" "B*44:02" "B*51:01" "C*14:02"
## CELL_ID_36 "C*15:05" "A*24:10" "A*29:01" "B*07:05" "B*51:01" "C*07:04"
## CELL_ID_38 "C*15:06" "A*11:117" "A*68:71" "B*07:26" "B*51:01" "C*03:04"
## CELL_ID_39 "C*06:02" "A*01:02"
                                   "A*66:01" "B*58:01" "B*58:01" "C*03:02"
## CELL_ID_41 "C*07:02" "A*11:01"
                                   "A*26:01" "B*07:06" "B*59:01" "C*01:02"
## CELL ID 45 "C*14:02" "A*02:01" "A*33:03" "B*15:16" "B*44:03" "C*04:01"
## CELL_ID_56 "C*04:01" "A*02:11"
                                   "A*68:01" "B*35:05" "B*40:04" "C*03:04"
                                   "A*30:01" "B*15:10" "B*58:01" "C*07:18"
              "C*08:04" "A*03:62"
## CELL ID 6
## CELL_ID_79 "C*12:02" "A*24:02" "A*24:02" "B*52:01" "B*52:01" "C*12:02"
## CELL_ID_94 "C*07:01" "A*01:01" "A*24:02" "B*08:01" "B*44:06" "C*05:01"
## CELL_ID_99 "C*06:02" "A*03:01" "A*03:01" "B*47:01" "B*47:01" "C*06:02"
                        V2
                                  VЗ
                                            ۷4
                                                      V5
## CELL ID 108 "C*07:04" "A*03:01" "A*31:01" "B*15:18" "B*35:03" "C*04:01"
## CELL ID 109 "C*03:04" "A*24:03" "A*33:03" "B*15:01" "B*46:01" "C*01:02"
## CELL_ID_122 "C*03:03" "A*02:01" "A*24:23" "B*15:01" "B*51:01" "C*03:03"
## CELL_ID_13 "C*07:01" "A*02:05" "A*32:01" "B*40:01" "B*49:01" "C*03:04"
## CELL_ID_16 "C*12:03" "A*24:02" "A*25:01" "B*18:01" "B*51:09" "C*01:02"
## CELL_ID_163 "C*07:02" "A*03:01" "A*32:01" "B*07:02" "B*44:17" "C*05:01"
## CELL_ID_165 "C*06:02" "A*02:01" "A*02:01" "B*35:31" "B*57:01" "C*02:02"
## CELL_ID_18 "C*06:02" "A*02:01" "A*32:01" "B*15:01" "B*27:08" "C*03:04"
## CELL_ID_21 "C*14:02" "A*02:01" "A*02:01" "B*44:02" "B*51:01" "C*07:04"
## CELL_ID_235 "C*16:04" "A*02:01" "A*31:01" "B*44:02" "B*51:01" "C*14:02"
## CELL ID 36 "C*15:29" "A*24:10" "A*29:01" "B*07:05" "B*51:01" "C*07:04"
## CELL ID 38 "C*07:02" "A*03:01" "A*11:01" "B*07:02" "B*51:01" "C*07:02"
## CELL ID 39 "C*06:02" "A*01:02" "A*66:01" "B*58:01" "B*58:02" "C*03:02"
## CELL_ID_41 "C*07:02" "A*11:01" "A*26:01" "B*07:06" "B*55:02" "C*01:02"
## CELL_ID_45 "C*14:02" "A*02:01" "A*33:03" "B*15:16" "B*44:03" "C*04:01"
## CELL_ID_56 "C*04:01" "A*02:11" "A*68:01" "B*35:05" "B*40:04" "C*03:04"
              "C*08:04" "A*03:01" "A*30:01" "B*15:10" "B*58:01" "C*07:01"
## CELL ID 6
## CELL ID 79 "C*12:02" "A*24:02" "A*24:02" "B*52:01" "B*52:01" "C*12:02"
              "C*07:01" "A*01:01" "A*24:02" "B*08:01" "B*44:06" "C*05:01"
## CELL ID 94
## CELL_ID_99
              "C*06:02" "A*03:01" "A*03:01" "B*47:01" "B*47:01" "C*06:02"
## CELL_ID_108 "C*07:04"
## CELL_ID_109 "C*03:04"
## CELL_ID_122 "C*03:04"
## CELL_ID_13 "C*07:01"
## CELL_ID_16 "C*12:03"
## CELL_ID_163 "C*07:02"
## CELL_ID_165 "C*06:02"
## CELL_ID_18 "C*06:02"
## CELL_ID_21 "C*14:02"
```

```
## CELL_ID_235 "C*16:04"
## CELL_ID_36
               "C*15:05"
## CELL ID 38
               "C*15:06"
## CELL_ID_39
               "C*06:02"
## CELL_ID_41
               "C*07:02"
## CELL ID 45
               "C*14:02"
## CELL ID 56
               "C*04:01"
## CELL_ID_6
                "C*08:04"
## CELL_ID_79
               "C*12:02"
## CELL_ID_94
               "C*07:01"
## CELL_ID_99
                "C*06:02"
```

For all alleles that possess a precise enough reference, prediction and reference were compared. The number of possible hits is the number of alleles per sample that is typed with a precision >= 4-digit, e.g. HLA-A\*02:01

#### print(accordance)

```
##
                optitype bwakit hlassign possible hits
## CELL ID 108
                        0
                                0
                        5
                                4
                                                          5
## CELL_ID_109
                                          4
## CELL_ID_122
                        5
                                4
                                          5
                                                          5
## CELL_ID_13
                        6
                                4
                                          6
                                                          6
## CELL_ID_16
                        1
                                1
                                          1
                                                          5
## CELL_ID_163
                                2
                                          2
                                                          2
                        1
                                1
                                                          2
## CELL_ID_165
                        1
                                          1
## CELL_ID_18
                        6
                                6
                                          6
                                                          6
## CELL_ID_21
                        0
                                0
                                          0
                                                          0
## CELL_ID_235
                        6
                                6
                                          6
                                                          6
## CELL_ID_36
                        6
                                5
                                          6
                                                          6
                                0
## CELL_ID_38
                        0
                                          0
                                                          6
## CELL_ID_39
                        5
                                5
                                          6
                                                          6
## CELL_ID_41
                        6
                                4
                                          5
                                                          6
                        6
                                6
## CELL_ID_45
                                          6
                                                          6
## CELL_ID_56
                        6
                                6
                                          6
                                                          6
## CELL_ID_6
                        5
                                5
                                          5
                                                          6
## CELL_ID_79
                        2
                                2
                                          2
                                                          2
## CELL_ID_94
                        1
                                1
                                          1
                                                          6
## CELL_ID_99
                        6
                                6
                                          6
                                                          6
```

### colSums(accordance)

##	optitype	bwakit	hlassign	possible hits
##	74	68	74	93

## (colSums(accordance)/colSums(accordance)[4])\*100

##	optitype	bwakit	hlassign	possible hits
##	79.56989	73.11828	79.56989	100.00000

3 samples can be identified with having wrong reference types assigned to them. To compute performance, we remove them and redo the calculations.

```
accordance = accordance [-c(5,19,12),]
colSums(accordance)
##
        optitype
                         bwakit
                                     hlassign possible hits
##
              72
                             66
                                            72
(colSums(accordance)/ colSums(accordance)[4])*100
##
        optitype
                         bwakit
                                     hlassign possible hits
##
        94.73684
                       86.84211
                                     94.73684
                                                   100.00000
```

Clearly, optitype and hlassign show better performance than bwakit for our sample set of 20 panels (HLA enriched).

print(rbind(accordance, colSums(accordance), (colSums(accordance)/ colSums(accordance)[ncol(accordance)]

```
##
                         bwakit hlassign possible hits
              optitype
## CELL_ID_108
               0.00000
                        0.00000 0.00000
                                                     0
## CELL_ID_109 5.00000
                        4.00000 4.00000
                                                     5
                                                     5
## CELL_ID_122
              5.00000
                        4.00000 5.00000
## CELL_ID_13
               6.00000
                        4.00000
                                6.00000
                                                     6
## CELL ID 163 1.00000
                        2.00000 2.00000
                                                     2
                                                     2
## CELL_ID_165 1.00000 1.00000 1.00000
## CELL ID 18
               6.00000
                        6.00000 6.00000
                                                     6
## CELL_ID_21
               0.00000
                        0.00000 0.00000
                                                     0
## CELL_ID_235 6.00000
                        6.00000 6.00000
                                                     6
                                                     6
## CELL_ID_36
               6.00000 5.00000 6.00000
## CELL_ID_39
               5.00000 5.00000 6.00000
                                                     6
## CELL_ID_41
               6.00000 4.00000
                                5.00000
                                                     6
                                                     6
## CELL_ID_45
               6.00000 6.00000 6.00000
## CELL_ID_56
               6.00000 6.00000
                                6.00000
                                                     6
## CELL_ID_6
               5.00000 5.00000 5.00000
                                                     6
                                                     2
## CELL_ID_79
               2.00000 2.00000 2.00000
## CELL_ID_99
               6.00000 6.00000 6.00000
                                                     6
##
              72.00000 66.00000 72.00000
                                                    76
##
              94.73684 86.84211 94.73684
                                                   100
```