# Clustering of performers based on different statistical techniques

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2023-04-27

### Preliminary analysis for movement Op.38i

# Pearson correlations between performers

#### Beat proportions and intensity fluctuations (both performers)

```
CH
                        DPB
                                   FB
                                           FvdP
                                                                 GGr
##
                                                                           GG11
## CH
        1.0000000 0.9531815 0.9512836 0.9456965 0.9587053 0.9571560 0.9612621
       0.9531815 1.0000000 0.9585092 0.9444712 0.9622570 0.9581066 0.9632615
        0.9512836 0.9585092 1.0000000 0.9506488 0.9561146 0.9530443 0.9584703
  FvdP 0.9456965 0.9444712 0.9506488 1.0000000 0.9460334 0.9452998 0.9513626
##
  GG
        0.9587053 0.9622570 0.9561146 0.9460334 1.0000000 0.9683811 0.9692207
  GGr
        0.9571560 0.9581066 0.9530443 0.9452998 0.9683811 1.0000000 0.9712297
        0.9612621 0.9632615 0.9584703 0.9513626 0.9692207 0.9712297 1.0000000
  GGu
        0.9607199 0.9612495 0.9630767 0.9539005 0.9686863 0.9622892 0.9654265
##
  MA
        0.9577994 0.9614223 0.9581056 0.9425407 0.9636148 0.9623579 0.9666204
##
        0.9500120 0.9527242 0.9501875 0.9473975 0.9610390 0.9609190 0.9620236
        0.9580110 0.9599386 0.9502508 0.9414416 0.9665917 0.9654645 0.9633568
##
  MT.
        0.9635413 0.9588870 0.9548645 0.9480152 0.9664562 0.9633707 0.9664400
        0.9613178 0.9608625 0.9511474 0.9445671 0.9629056 0.9641748 0.9661441
  PR36 0.9542970 0.9584757 0.9569146 0.9537925 0.9573981 0.9559258 0.9605835
  PR66 0.9602102 0.9608088 0.9544620 0.9519831 0.9649963 0.9638995 0.9637649
        0.9579390 0.9529783 0.9507882 0.9422790 0.9580070 0.9551010 0.9579426
        0.9612466 0.9611475 0.9576222 0.9518495 0.9644610 0.9624393 0.9615509
##
  PV
##
  RS
        0.9566457 0.9493038 0.9527743 0.9491487 0.9524581 0.9579118 0.9569086
##
  SB
        0.9585954 0.9583258 0.9583323 0.9638230 0.9623021 0.9618309 0.9639127
##
  SS
        0.9614979 0.9624061 0.9581970 0.9519497 0.9640265 0.9620020 0.9616599
##
               ΙH
                         MA
                                   MG
                                             ML
                                                        MP
        0.9607199 0.9577994 0.9500120 0.9580110 0.9635413 0.9613178 0.9542970
##
  CH
  DPB
        0.9612495 0.9614223 0.9527242 0.9599386 0.9588870 0.9608625 0.9584757
        0.9630767 0.9581056 0.9501875 0.9502508 0.9548645 0.9511474 0.9569146
  FΒ
       0.9539005 0.9425407 0.9473975 0.9414416 0.9480152 0.9445671 0.9537925
  GG
        0.9686863 0.9636148 0.9610390 0.9665917 0.9664562 0.9629056 0.9573981
        0.9622892 0.9623579 0.9609190 0.9654645 0.9633707 0.9641748 0.9559258
  GGu
       0.9654265 0.9666204 0.9620236 0.9633568 0.9664400 0.9661441 0.9605835
        1.0000000 0.9648417 0.9612308 0.9638911 0.9652671 0.9630916 0.9615655
        0.9648417 1.0000000 0.9558977 0.9623294 0.9647337 0.9667259 0.9596004
##
  MG
        0.9612308 0.9558977 1.0000000 0.9575019 0.9574589 0.9560572 0.9529392
        0.9638911 0.9623294 0.9575019 1.0000000 0.9630310 0.9656824 0.9578372
  MP
        0.9652671 0.9647337 0.9574589 0.9630310 1.0000000 0.9664639 0.9558978
        0.9630916 0.9667259 0.9560572 0.9656824 0.9664639 1.0000000 0.9572582
## PR36 0.9615655 0.9596004 0.9529392 0.9578372 0.9558978 0.9572582 1.0000000
```

```
## PR66 0.9658770 0.9629676 0.9557778 0.9615827 0.9626116 0.9609561 0.9653411
        0.9611471 0.9554691 0.9461958 0.9542201 0.9563768 0.9546600 0.9578870
## PS
## PV
        0.9639513 0.9623891 0.9595413 0.9610146 0.9631639 0.9612464 0.9628703
        0.9574043 0.9562732 0.9525267 0.9543925 0.9545332 0.9590755 0.9584339
##
  R.S
##
  SB
        0.9654520 0.9636933 0.9608185 0.9597772 0.9637281 0.9625302 0.9634009
        0.9637748 0.9624150 0.9591512 0.9608093 0.9621274 0.9618295 0.9637273
##
  SS
##
             PR66
                         PS
                                   PV
                                             R.S
                                                        SB
                                                                  SS
## CH
        0.9602102 0.9579390 0.9612466 0.9566457 0.9585954 0.9614979
  DPB
       0.9608088 0.9529783 0.9611475 0.9493038 0.9583258 0.9624061
        0.9544620 0.9507882 0.9576222 0.9527743 0.9583323 0.9581970
## FB
  FvdP 0.9519831 0.9422790 0.9518495 0.9491487 0.9638230 0.9519497
        0.9649963 0.9580070 0.9644610 0.9524581 0.9623021 0.9640265
##
  GG
##
       0.9638995 0.9551010 0.9624393 0.9579118 0.9618309 0.9620020
  GGr
##
  GGu
       0.9637649 0.9579426 0.9615509 0.9569086 0.9639127 0.9616599
        0.9658770 0.9611471 0.9639513 0.9574043 0.9654520 0.9637748
## TH
## MA
        0.9629676 0.9554691 0.9623891 0.9562732 0.9636933 0.9624150
        0.9557778 0.9461958 0.9595413 0.9525267 0.9608185 0.9591512
## MG
        0.9615827 0.9542201 0.9610146 0.9543925 0.9597772 0.9608093
## ML
        0.9626116 0.9563768 0.9631639 0.9545332 0.9637281 0.9621274
## MP
## PN
        0.9609561 0.9546600 0.9612464 0.9590755 0.9625302 0.9618295
## PR36 0.9653411 0.9578870 0.9628703 0.9584339 0.9634009 0.9637273
## PR66 1.0000000 0.9608518 0.9649150 0.9534587 0.9649276 0.9655821
        0.9608518 1.0000000 0.9582936 0.9517269 0.9551388 0.9588755
## PS
        0.9649150 0.9582936 1.0000000 0.9608649 0.9708049 0.9964473
## PV
## R.S
        0.9534587 0.9517269 0.9608649 1.0000000 0.9624712 0.9615056
## SB
        0.9649276 0.9551388 0.9708049 0.9624712 1.0000000 0.9704118
## SS
        0.9655821 0.9588755 0.9964473 0.9615056 0.9704118 1.0000000
```

#### Note length (cellists)

```
DPB
                                   FΒ
                                           FvdP
                                                        GG
                                                                 GGr
        1.0000000 0.9667869 0.9573907 0.9717331 0.9712709 0.9665624 0.9700948
## CH
## DPR
       0.9667869 1.0000000 0.9649408 0.9776657 0.9794039 0.9821809 0.9689534
        0.9573907 0.9649408 1.0000000 0.9699458 0.9671198 0.9647606 0.9585442
## FvdP 0.9717331 0.9776657 0.9699458 1.0000000 0.9867930 0.9813036 0.9774349
## GG
        0.9712709 0.9794039 0.9671198 0.9867930 1.0000000 0.9865932 0.9712443
       0.9665624 0.9821809 0.9647606 0.9813036 0.9865932 1.0000000 0.9623749
##
  GGr
  GG_{11}
       0.9700948 0.9689534 0.9585442 0.9774349 0.9712443 0.9623749 1.0000000
## TH
        0.3418444 0.3322913 0.3070080 0.3186785 0.3268099 0.3241173 0.3166858
        0.9756406 0.9866967 0.9726635 0.9844223 0.9856458 0.9830990 0.9789714
## MA
        0.9397035 0.9569621 0.9379605 0.9503249 0.9554809 0.9466002 0.9438449
## MG
        0.9634690 0.9815890 0.9614069 0.9737243 0.9785399 0.9817385 0.9607090
## MT.
        0.9754588 0.9842357 0.9717841 0.9875392 0.9853504 0.9821903 0.9830504
## MP
  PN
        0.7636335 0.7611846 0.7491453 0.7659420 0.7644177 0.7607464 0.7552026
  PR36 0.9700082 0.9835933 0.9689935 0.9836862 0.9819442 0.9781010 0.9758601
## PR66 0.3977847 0.4126421 0.3906608 0.3795303 0.3881774 0.3881717 0.3937179
        0.9597558 0.9753596 0.9668695 0.9791410 0.9792532 0.9816812 0.9568483
## PS
## PV
        0.9720745 0.9808842 0.9727569 0.9891464 0.9838190 0.9790651 0.9769927
## RS
        0.9735675 0.9811501 0.9714454 0.9895314 0.9869767 0.9804173 0.9807303
##
        0.9746513 0.9768169 0.9689474 0.9880983 0.9851053 0.9776059 0.9813602
  SB
        0.9545953 0.9573473 0.9579482 0.9746232 0.9649960 0.9553614 0.9614027
##
  SS
##
               ΙH
                                   MG
                                             ML
                                                        MP
                                                                  PN
                         MΑ
                                                                          PR.36
## CH
        0.3418444 0.9756406 0.9397035 0.9634690 0.9754588 0.7636335 0.9700082
       0.3322913 0.9866967 0.9569621 0.9815890 0.9842357 0.7611846 0.9835933
## DPB
```

```
0.3070080 0.9726635 0.9379605 0.9614069 0.9717841 0.7491453 0.9689935
## FvdP 0.3186785 0.9844223 0.9503249 0.9737243 0.9875392 0.7659420 0.9836862
        0.3268099 0.9856458 0.9554809 0.9785399 0.9853504 0.7644177 0.9819442
       0.3241173 0.9830990 0.9466002 0.9817385 0.9821903 0.7607464 0.9781010
##
  GGr
##
  GG11
       0.3166858 0.9789714 0.9438449 0.9607090 0.9830504 0.7552026 0.9758601
        1.0000000 0.3261228 0.3025313 0.3355327 0.3323822 0.2582606 0.3232396
##
  TH
## MA
        0.3261228 1.0000000 0.9606846 0.9821945 0.9911958 0.7667028 0.9871266
## MG
        0.3025313 0.9606846 1.0000000 0.9475222 0.9563581 0.7582798 0.9555047
## ML
        0.3355327 0.9821945 0.9475222 1.0000000 0.9789341 0.7638669 0.9778728
## MP
        0.3323822 0.9911958 0.9563581 0.9789341 1.0000000 0.7682784 0.9874058
## PN
        0.2582606 0.7667028 0.7582798 0.7638669 0.7682784 1.0000000 0.7588200
  PR36 0.3232396 0.9871266 0.9555047 0.9778728 0.9874058 0.7588200 1.0000000
  PR66 0.5675339 0.4071421 0.4170518 0.4098774 0.3940486 0.2977591 0.4032639
## PS
        0.3171816 0.9799691 0.9474288 0.9734188 0.9779102 0.7505050 0.9797239
## PV
        0.3298838 0.9865120 0.9500012 0.9775710 0.9880043 0.7723578 0.9834702
##
  RS
        0.3157052 0.9894658 0.9591058 0.9768591 0.9894414 0.7548110 0.9873705
        0.3185946 0.9866579 0.9548573 0.9726746 0.9878680 0.7564433 0.9865077
##
  SB
##
  SS
        0.3143701 0.9717526 0.9360098 0.9581732 0.9723183 0.7540820 0.9700100
##
             PR66
                         PS
                                   ΡV
                                             R.S
                                                        SB
                                                                  SS
##
  CH
        0.3977847 0.9597558 0.9720745 0.9735675 0.9746513 0.9545953
##
  DPB
       0.4126421 0.9753596 0.9808842 0.9811501 0.9768169 0.9573473
        0.3906608 0.9668695 0.9727569 0.9714454 0.9689474 0.9579482
## FB
## FvdP 0.3795303 0.9791410 0.9891464 0.9895314 0.9880983 0.9746232
        0.3881774 0.9792532 0.9838190 0.9869767 0.9851053 0.9649960
##
  GG
##
  GGr
       0.3881717 0.9816812 0.9790651 0.9804173 0.9776059 0.9553614
  GGu
       0.3937179 0.9568483 0.9769927 0.9807303 0.9813602 0.9614027
        0.5675339 0.3171816 0.3298838 0.3157052 0.3185946 0.3143701
##
  ΙH
##
        0.4071421 0.9799691 0.9865120 0.9894658 0.9866579 0.9717526
  MΑ
        0.4170518 0.9474288 0.9500012 0.9591058 0.9548573 0.9360098
## MG
        0.4098774 0.9734188 0.9775710 0.9768591 0.9726746 0.9581732
## ML
## MP
        0.3940486 0.9779102 0.9880043 0.9894414 0.9878680 0.9723183
##
  PN
        0.2977591 0.7505050 0.7723578 0.7548110 0.7564433 0.7540820
  PR36 0.4032639 0.9797239 0.9834702 0.9873705 0.9865077 0.9700100
## PR66 1.0000000 0.4084904 0.3902477 0.4011594 0.3970864 0.3775720
## PS
        0.4084904 1.0000000 0.9765537 0.9823578 0.9780663 0.9631382
## PV
        0.3902477 0.9765537 1.0000000 0.9880733 0.9867173 0.9832325
## RS
        0.4011594 0.9823578 0.9880733 1.0000000 0.9911724 0.9753837
        0.3970864 0.9780663 0.9867173 0.9911724 1.0000000 0.9760030
## SB
## SS
        0.3775720 0.9631382 0.9832325 0.9753837 0.9760030 1.0000000
```

#### Note length (pianinsts)

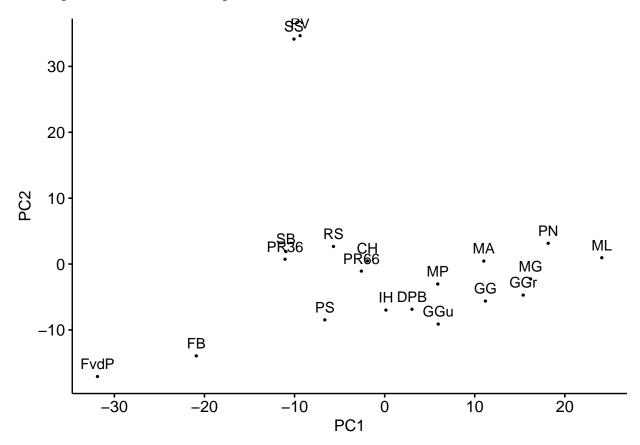
```
##
               CH
                        DPB
                                   FB
                                           FvdP
                                                        GG
                                                                 GGr
                                                                           GG11
        1.0000000 0.9806224 0.9632140 0.9786377 0.9837554 0.9846693 0.9798355
## CH
## DPB
       0.9806224 1.0000000 0.9556286 0.9678436 0.9798830 0.9818379 0.9750676
        0.9632140 0.9556286 1.0000000 0.9673834 0.9641601 0.9603359 0.9641894
## FB
## FvdP 0.9786377 0.9678436 0.9673834 1.0000000 0.9814015 0.9741765 0.9831002
        0.9837554 0.9798830 0.9641601 0.9814015 1.0000000 0.9826988 0.9814560
## GG
        0.9846693 0.9818379 0.9603359 0.9741765 0.9826988 1.0000000 0.9775736
       0.9798355 0.9750676 0.9641894 0.9831002 0.9814560 0.9775736 1.0000000
## GGu
        0.7171397 0.7216360 0.7250365 0.7301148 0.7156814 0.7188343 0.7274809
  ΙH
## MA
        0.9629720 0.9620726 0.9506806 0.9666511 0.9667960 0.9538343 0.9701632
##
  MG
        0.9654095 0.9671974 0.9476033 0.9556470 0.9717163 0.9617129 0.9659121
        0.9152039 0.9210818 0.8952921 0.9128394 0.9179186 0.9214403 0.9187598
## ML
```

```
0.9838977 0.9800811 0.9656450 0.9818961 0.9835973 0.9790514 0.9852515
        0.9841424 0.9818114 0.9640232 0.9756303 0.9869961 0.9875764 0.9800965
## PN
## PR36 0.9753213 0.9743151 0.9617045 0.9728058 0.9744394 0.9723772 0.9778731
## PR66 0.9783257 0.9738884 0.9670266 0.9815601 0.9790462 0.9730969 0.9835137
## PS
        0.8900698 0.8874812 0.8821469 0.8959386 0.8947615 0.8907926 0.8988567
## PV
       0.9786458 0.9749943 0.9644989 0.9816157 0.9814500 0.9743816 0.9772050
       0.8285222 0.8351360 0.8126126 0.8325935 0.8277899 0.8289385 0.8278693
## R.S
## SB
       0.9270004 0.9238654 0.9188459 0.9458803 0.9371500 0.9199346 0.9464493
##
  SS
        0.9643213 0.9635600 0.9505969 0.9673709 0.9685146 0.9631334 0.9647045
##
               TH
                         MA
                                   MG
                                             ML
                                                       MP
                                                                 PN
## CH
        0.7171397 0.9629720 0.9654095 0.9152039 0.9838977 0.9841424 0.9753213
       0.7216360 0.9620726 0.9671974 0.9210818 0.9800811 0.9818114 0.9743151
## DPB
## FB
        0.7250365 0.9506806 0.9476033 0.8952921 0.9656450 0.9640232 0.9617045
## FvdP 0.7301148 0.9666511 0.9556470 0.9128394 0.9818961 0.9756303 0.9728058
        0.7156814 0.9667960 0.9717163 0.9179186 0.9835973 0.9869961 0.9744394
## GG
## GGr
       0.7188343 0.9538343 0.9617129 0.9214403 0.9790514 0.9875764 0.9723772
       0.7274809 0.9701632 0.9659121 0.9187598 0.9852515 0.9800965 0.9778731
##
  GG_{11}
        1.0000000 0.7429870 0.6990945 0.7021744 0.7260459 0.7159121 0.7286807
##
  ΙH
        0.7429870 1.0000000 0.9524990 0.8918468 0.9725278 0.9631844 0.9632218
## MA
## MG
       0.6990945 0.9524990 1.0000000 0.9061342 0.9682399 0.9713493 0.9636377
## ML
       0.7021744 0.8918468 0.9061342 1.0000000 0.9189143 0.9148692 0.9115103
        0.7260459 0.9725278 0.9682399 0.9189143 1.0000000 0.9829999 0.9789246
       0.7159121 \ 0.9631844 \ 0.9713493 \ 0.9148692 \ 0.9829999 \ 1.0000000 \ 0.9736033
## PN
## PR36 0.7286807 0.9632218 0.9636377 0.9115103 0.9789246 0.9736033 1.0000000
## PR66 0.7291755 0.9708124 0.9659589 0.9158768 0.9847333 0.9752941 0.9822682
       0.7940306 0.9153286 0.8799235 0.8490185 0.8952168 0.8953810 0.8978381
## PV
       0.7230654 0.9657360 0.9603907 0.9125275 0.9825864 0.9792513 0.9754857
## RS
       0.7129126 0.8179262 0.8110011 0.8338261 0.8276732 0.8275864 0.8361934
       0.7714064 0.9513657 0.9200073 0.8877429 0.9415216 0.9254705 0.9354279
## SB
## SS
        0.7350889 0.9527445 0.9500085 0.9028541 0.9694750 0.9672584 0.9636132
##
             PR66
                         PS
                                   PV
                                             RS
                                                       SB
                                                                 SS
## CH
        0.9783257 0.8900698 0.9786458 0.8285222 0.9270004 0.9643213
  DPB
       0.9738884 0.8874812 0.9749943 0.8351360 0.9238654 0.9635600
        0.9670266 0.8821469 0.9644989 0.8126126 0.9188459 0.9505969
## FB
## FvdP 0.9815601 0.8959386 0.9816157 0.8325935 0.9458803 0.9673709
        0.9790462 0.8947615 0.9814500 0.8277899 0.9371500 0.9685146
## GG
       0.9730969 0.8907926 0.9743816 0.8289385 0.9199346 0.9631334
       ##
  GG_{11}
       0.7291755 0.7940306 0.7230654 0.7129126 0.7714064 0.7350889
##
  TH
       0.9708124 0.9153286 0.9657360 0.8179262 0.9513657 0.9527445
##
  MΑ
  MG
       0.9659589 0.8799235 0.9603907 0.8110011 0.9200073 0.9500085
       0.9158768 0.8490185 0.9125275 0.8338261 0.8877429 0.9028541
## MT.
## MP
       0.9847333 0.8952168 0.9825864 0.8276732 0.9415216 0.9694750
       0.9752941 0.8953810 0.9792513 0.8275864 0.9254705 0.9672584
## PR36 0.9822682 0.8978381 0.9754857 0.8361934 0.9354279 0.9636132
## PR66 1.0000000 0.8970269 0.9807395 0.8309055 0.9435544 0.9669144
## PS
       0.8970269 1.0000000 0.8957204 0.7978088 0.9464841 0.8868000
       0.9807395 0.8957204 1.0000000 0.8385536 0.9414758 0.9828197
## PV
## RS
       0.8309055 0.7978088 0.8385536 1.0000000 0.8116067 0.8280435
## SB
        0.9435544 0.9464841 0.9414758 0.8116067 1.0000000 0.9307497
## SS
       0.9669144 0.8868000 0.9828197 0.8280435 0.9307497 1.0000000
```

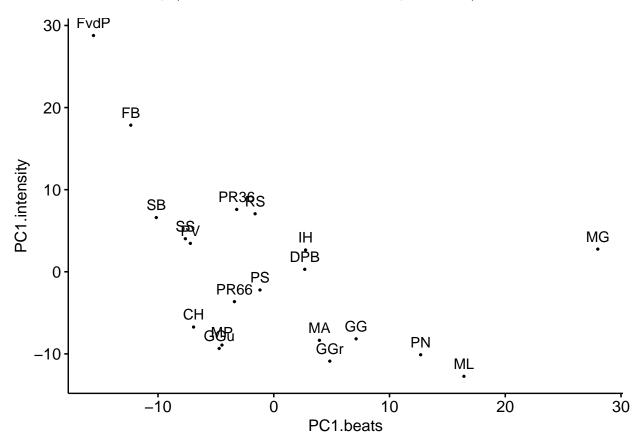
# Cluster analysis of performers by beat and intensity (both) PCA

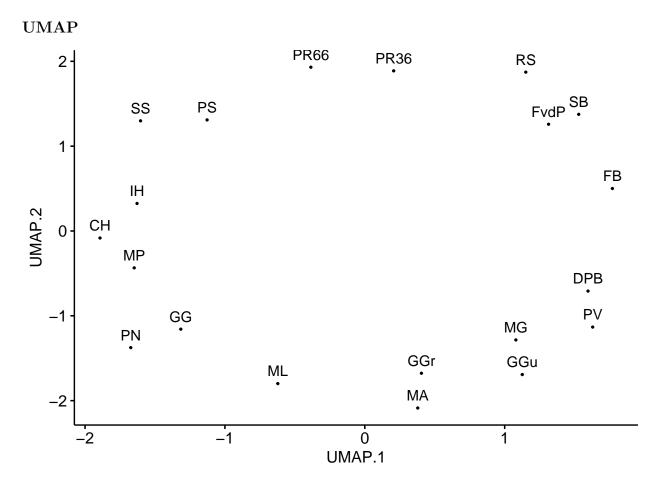
```
## Importance of components:
##
                                        PC2
                                                 PC3
                                                           PC4
                                                                    PC5
                                                                             PC6
                               PC1
## Standard deviation
                          13.96773 12.96788 12.69011 12.18284 11.89206 11.48675
## Proportion of Variance 0.09032 0.07785
                                             0.07456
                                                      0.06871
                                                                0.06547
## Cumulative Proportion
                           0.09032
                                    0.16818
                                             0.24273
                                                      0.31145
                                                                0.37692
                                                                         0.43800
                                                         PC10
##
                              PC7
                                       PC8
                                                PC9
                                                                  PC11
                                                                          PC12
                          11.1252 11.00024 10.64796 10.40829 10.18348 9.98254
## Standard deviation
## Proportion of Variance 0.0573
                                   0.05602 0.05249
                                                     0.05015
                                                               0.04801 0.04613
## Cumulative Proportion
                           0.4953
                                   0.55133 0.60382 0.65397
                                                               0.70198 0.74812
##
                             PC13
                                     PC14
                                             PC15
                                                     PC16
                                                             PC17
## Standard deviation
                          9.71908 9.63471 9.49922 9.37178 9.02873 8.81153 4.42201
## Proportion of Variance 0.04373 0.04298 0.04178 0.04066 0.03774 0.03595 0.00905
  Cumulative Proportion 0.79185 0.83482 0.87660 0.91726 0.95500 0.99095 1.00000
                           PC20
## Standard deviation
                          3e-14
## Proportion of Variance 0e+00
## Cumulative Proportion 1e+00
```

#### Plot of performers in PCA components



Plot of beat vs intensity (PC1 beat variables, PC1 intensity variables)

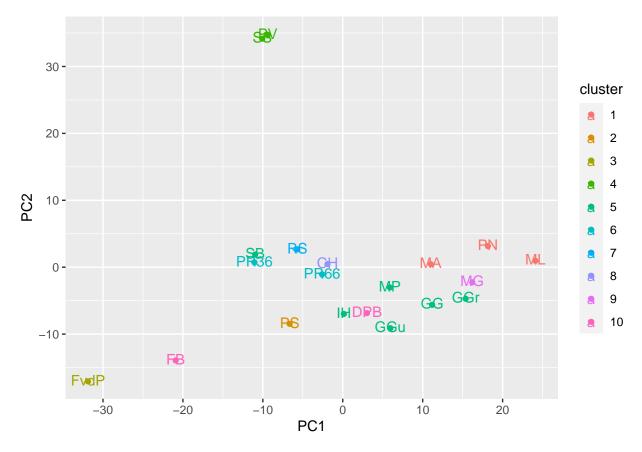




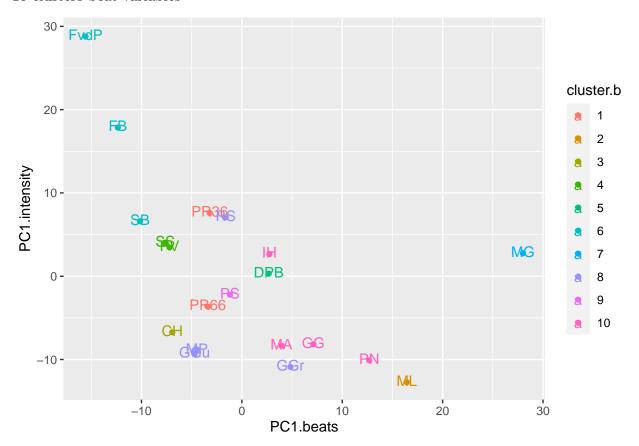
Very unstable, changes every time it's run significantly.

## K-means

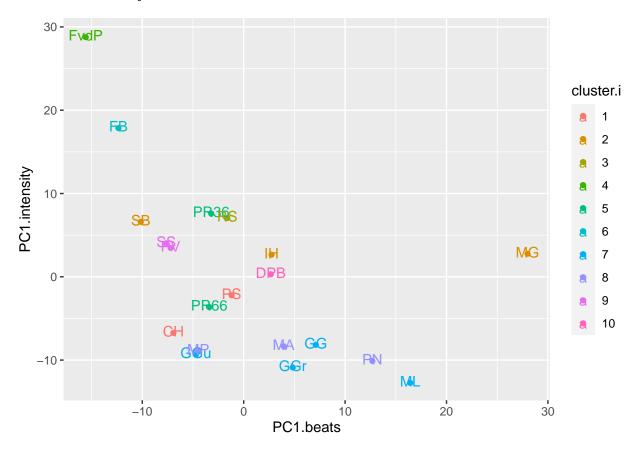
## 10 clusters beat+intensity



### 10 clusters beat variables



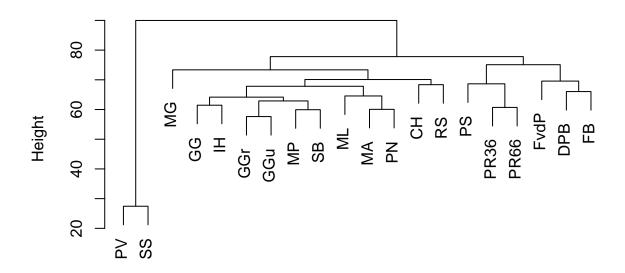
## 10 clusters intensity variables



## Dendograms

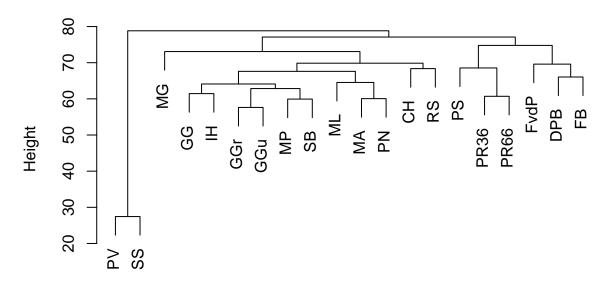
 ${\bf Dendograms\ beat+intensity}$ 

# **Cluster Dendrogram**

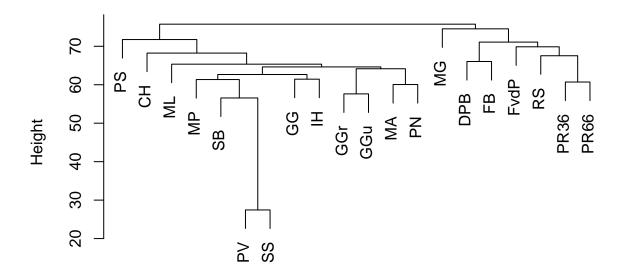


dist\_matrix hclust (\*, "ward.D")

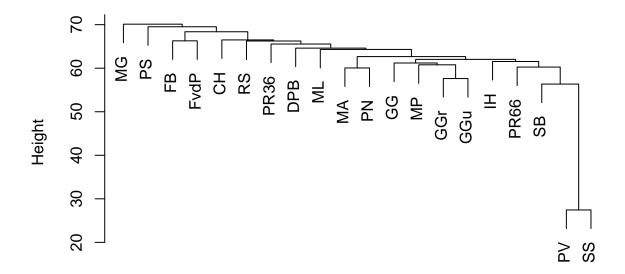
# **Cluster Dendrogram**



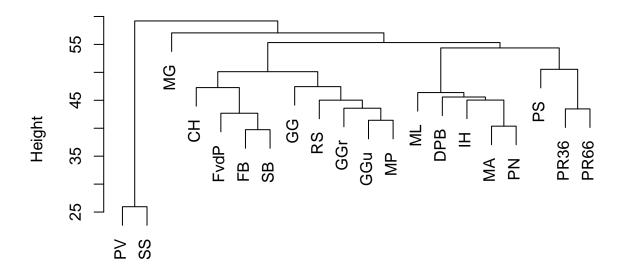
dist\_matrix hclust (1/4, "ward.D2")



dist\_matrix hclust (\*, "complete")

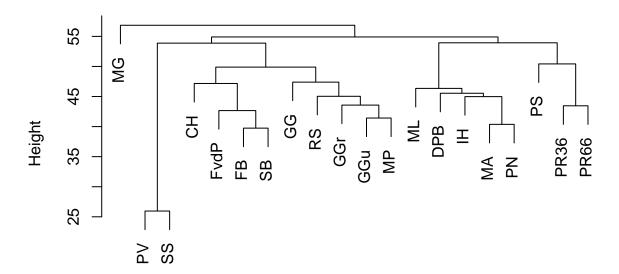


dist\_matrix hclust (\*, "average")

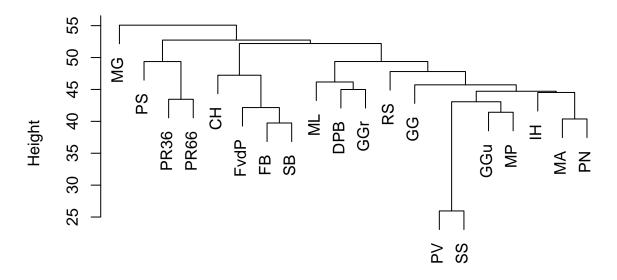


dist\_matrix hclust (\*, "ward.D")

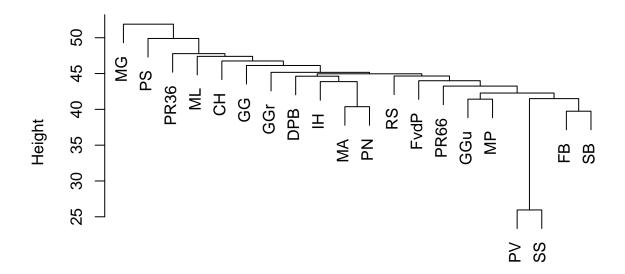
# **Cluster Dendrogram**



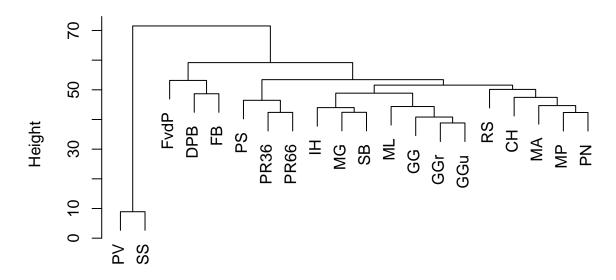
dist\_matrix hclust (\*, "ward.D2")



dist\_matrix hclust (\*, "complete")

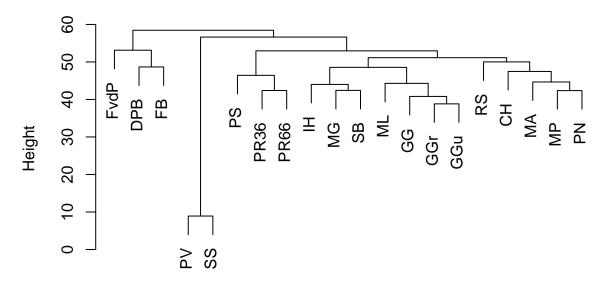


dist\_matrix hclust (\*, "average")

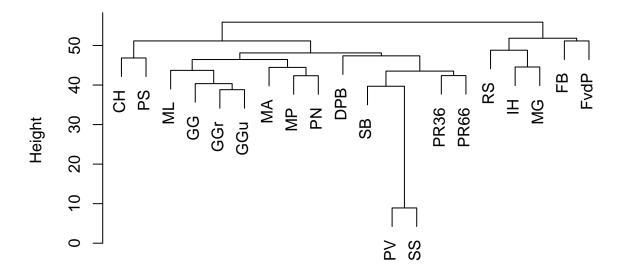


dist\_matrix hclust (\*, "ward.D")

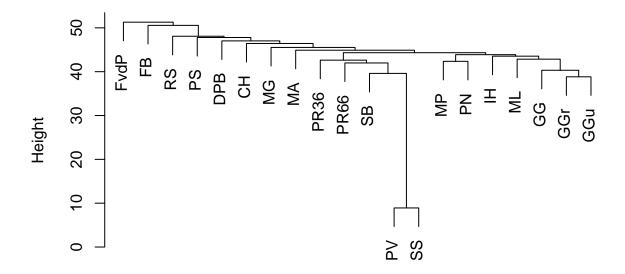
# **Cluster Dendrogram**



dist\_matrix hclust (\*, "ward.D2")



dist\_matrix hclust (\*, "complete")



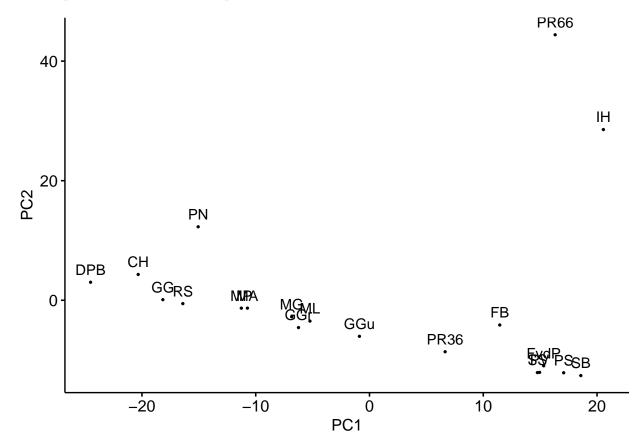
dist\_matrix
hclust (\*, "average")

# Cluster analysis for cellists (note length)

#### **PCA**

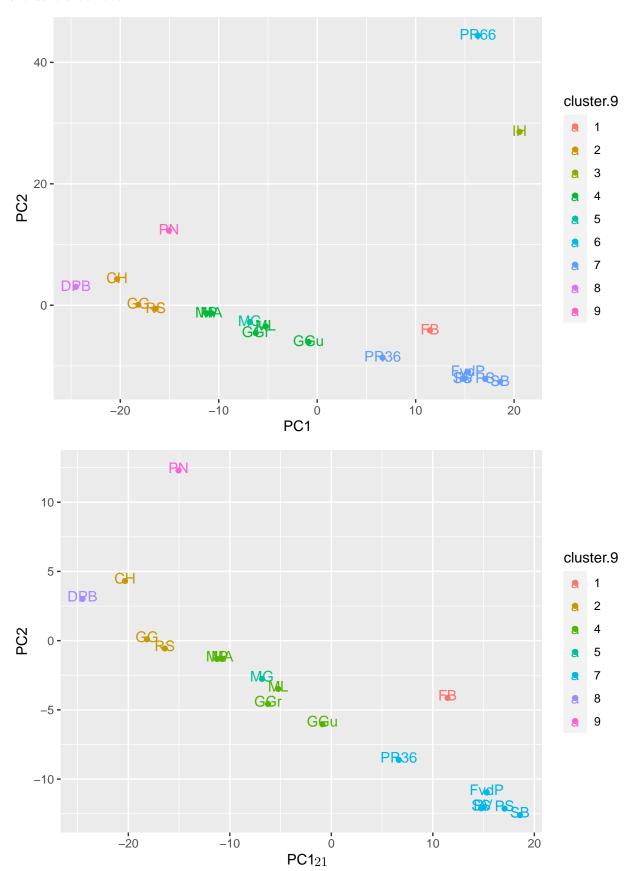
```
## Importance of components:
                                      PC2
                                               PC3
                                                       PC4
                                                               PC5
                                                                      PC6
                                                                              PC7
##
                              PC1
## Standard deviation
                          15.1694 14.2465 11.5318 8.95145 6.36640 5.6852 5.29180
## Proportion of Variance
                          0.2456
                                   0.2166
                                           0.1419 0.08552 0.04326 0.0345 0.02989
## Cumulative Proportion
                           0.2456
                                   0.4622
                                           0.6041 0.68963 0.73289 0.7674 0.79727
##
                              PC8
                                     PC9
                                            PC10
                                                     PC11
                                                             PC12
                                                                    PC13
## Standard deviation
                          5.12125 4.7326 4.66097 4.44032 4.24400 3.9320 3.83974
## Proportion of Variance 0.02799 0.0239 0.02319 0.02104 0.01922 0.0165 0.01573
## Cumulative Proportion 0.82526 0.8492 0.87235 0.89339 0.91261 0.9291 0.94485
##
                             PC15
                                     PC16
                                              PC17
                                                     PC18
                                                            PC19
                                                                      PC20
## Standard deviation
                          3.63833 3.53873 3.43084 2.9680 2.3103 1.133e-14
## Proportion of Variance 0.01413 0.01336 0.01256 0.0094 0.0057 0.000e+00
## Cumulative Proportion 0.95898 0.97234 0.98490 0.9943 1.0000 1.000e+00
```

Plot of performers in PCA components

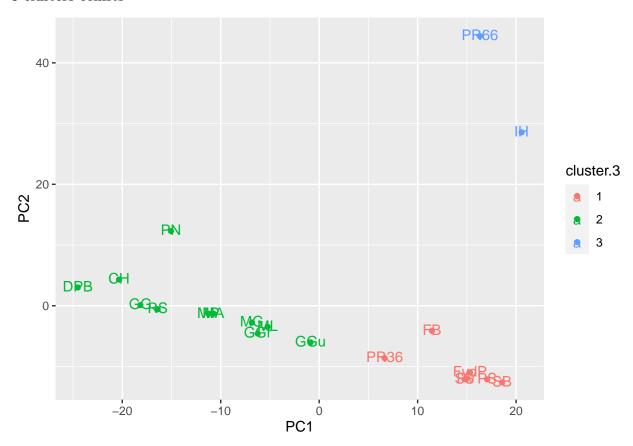


#### K-means

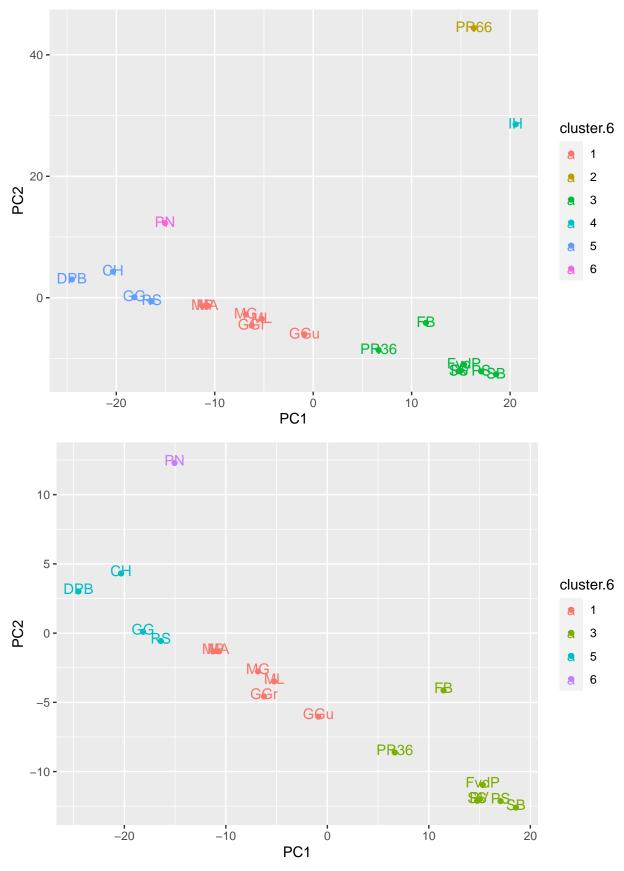
#### 9 clusters cellists



### 3 clusters cellists

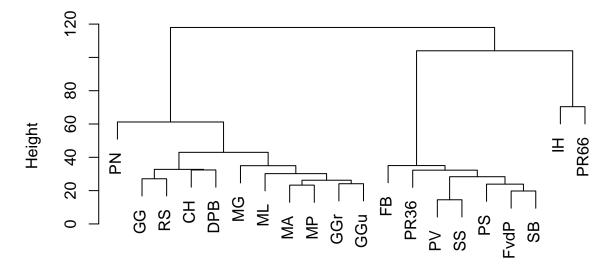


#### 6 clusters cellists



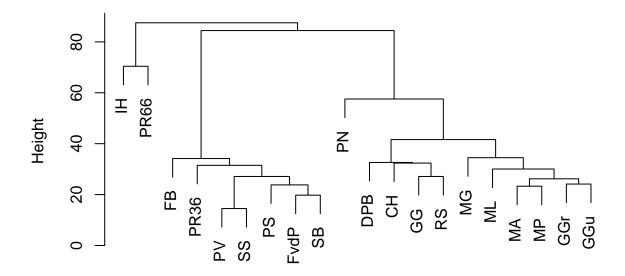
## Dendograms cellists

# **Cluster Dendrogram**

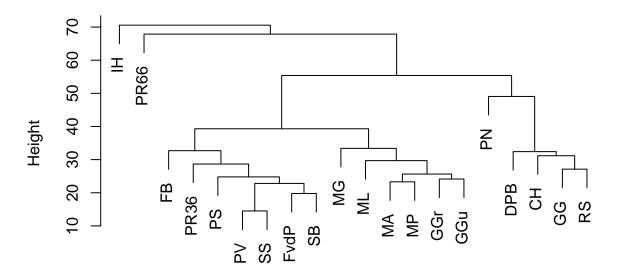


dist\_matrix hclust (\*, "ward.D")

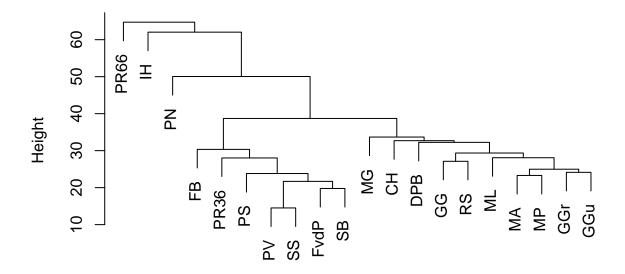
# **Cluster Dendrogram**



 $\begin{array}{c} {\rm dist\_matrix} \\ {\rm hclust}~(\hbox{\tt ''},\hbox{\tt ''ward.D2''}) \\ \end{array}$ 



dist\_matrix hclust (\*, "complete")



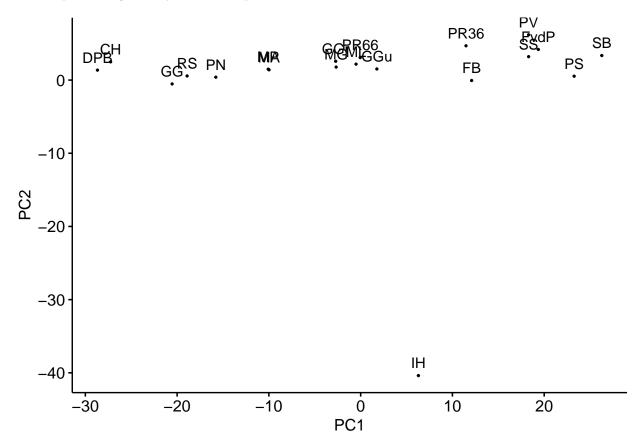
dist\_matrix
hclust (\*, "average")

# Cluster analysis for pianists (note length)

#### **PCA**

```
## Importance of components:
                                      PC2
                                              PC3
                                                       PC4
                                                               PC5
                                                                      PC6
                                                                              PC7
##
                              PC1
## Standard deviation
                          16.8694 9.64987 7.54648 7.11032 7.07040 6.4861 6.28314
## Proportion of Variance
                          0.3037 0.09938 0.06078 0.05396 0.05335 0.0449 0.04213
## Cumulative Proportion
                           0.3037 0.40309 0.46387 0.51783 0.57118 0.6161 0.65821
##
                              PC8
                                      PC9
                                             PC10
                                                      PC11
                                                              PC12
                                                                      PC13
                                                                              PC14
## Standard deviation
                          6.08622 6.03170 5.81967 5.70716 5.33477 5.14669 5.04024
## Proportion of Variance 0.03953 0.03883 0.03615 0.03476 0.03037 0.02827 0.02711
                          0.69774 0.73657 0.77271 0.80748 0.83785 0.86612 0.89323
## Cumulative Proportion
##
                             PC15
                                     PC16
                                              PC17
                                                      PC18
                                                              PC19
                                                                        PC20
## Standard deviation
                          4.92567 4.77399 4.64024 4.04716 3.88318 1.298e-14
## Proportion of Variance 0.02589 0.02432 0.02298 0.01748 0.01609 0.000e+00
## Cumulative Proportion 0.91912 0.94345 0.96643 0.98391 1.00000 1.000e+00
```

Plot of pianists given by PCA components

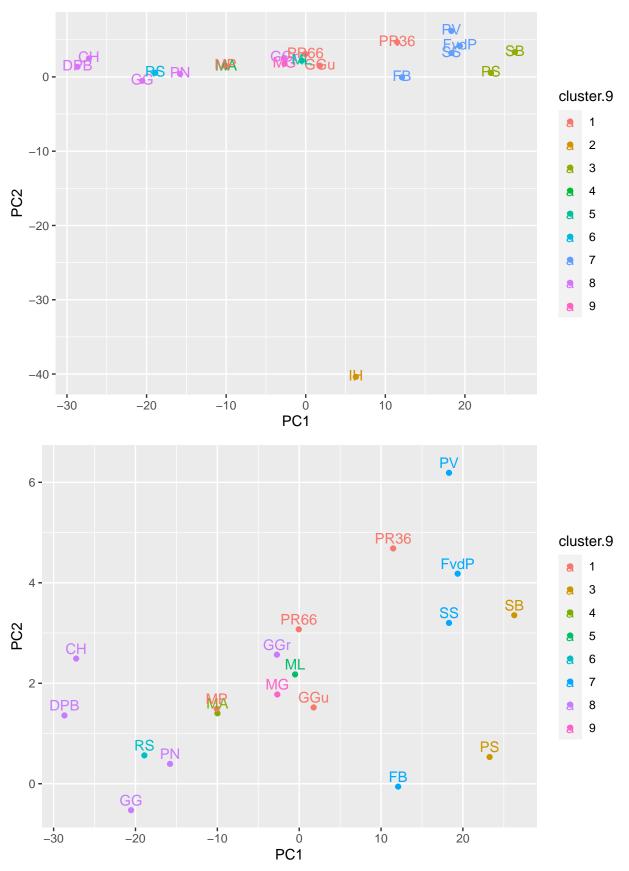


### K-means

### 3 clusters pianists

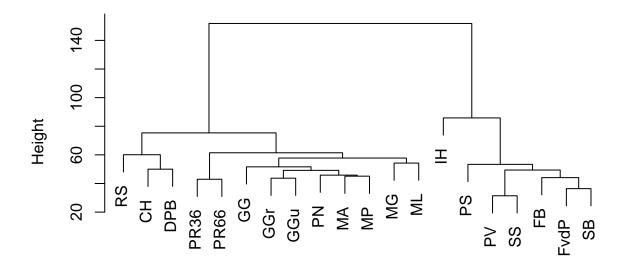


## 9 clusters pianists



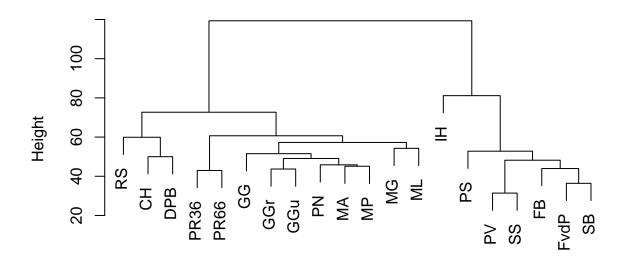
## Dendograms pianists

# **Cluster Dendrogram**

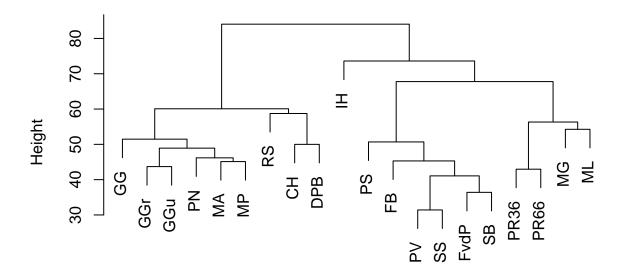


dist\_matrix hclust (\*, "ward.D")

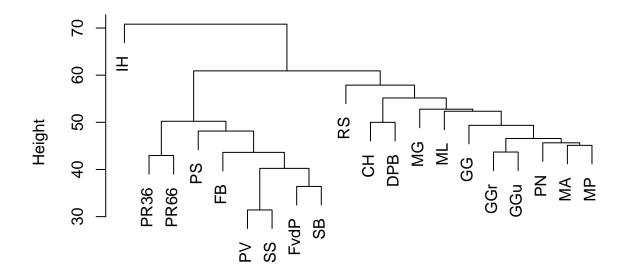
# **Cluster Dendrogram**



dist\_matrix hclust (\*, "ward.D2") 30



dist\_matrix hclust (\*, "complete")



dist\_matrix
hclust (\*, "average")

# Summary

PV-SS always together. Also PR36-PR66.

 $\operatorname{FvdP}$  different in intensity, MG different in beat.

#### **Clusters:**

#### beat + intensity

SB-IH-MP-GGu-GG-GGr MA-PN-ML PV-SS DPB-FB PR36-PR66 FvdP MG PS RS CH

#### beat

 $IH\text{-}MA\text{-}GG\text{-}PN\ MP\text{-}GGu\text{-}GGr\text{-}RS\ FvdP\text{-}FB\text{-}SB\ PV\text{-}SS\ PR36\text{-}PR66\ PS\ DPB\ ML\ MG\ CH$ 

#### intensity

GG-GGu-GGr-ML MP-MA-PN SB-IH-MG

 $\operatorname{PV-SS}$ PR36-PR66 PS-CH FvdP FB PS CH