# ANOVA

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Here, I tried to make the Race as an ordered categorical data.

## Check if there's round effect in the game

The result shows that there's no significant difference only considering the round and the player effect

## Check if there's race # effect in the game

```
race_no_aov <- aov(`Completion Time(s)` ~ Race, data=Mdata)</pre>
summary(race_no_aov)
##
               Df Sum Sq Mean Sq F value
                                           Pr(>F)
                    6925
                           407.4
                                   5.874 2.73e-07 ***
## Race
               17
## Residuals
               54
                    3745
                            69.3
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
summary(lm(race_no_aov))
##
## Call:
## lm(formula = race_no_aov)
##
```

```
## Residuals:
##
       Min
                 1Q Median
                                  30
                                         Max
                                      21.905
##
  -13.732 -4.976 -1.044
                               4.427
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 131.6125
                              0.9814 134.107
                                               < 2e-16 ***
## Race.L
                  2.5026
                              4.1637
                                       0.601
                                               0.55033
## Race.Q
                  3.1241
                              4.1637
                                       0.750
                                               0.45631
## Race.C
                 -2.3216
                              4.1637
                                      -0.558
                                               0.57943
## Race<sup>4</sup>
                  6.4103
                              4.1637
                                       1.540
                                               0.12951
## Race<sup>5</sup>
                  3.7108
                              4.1637
                                       0.891
                                               0.37677
## Race<sup>6</sup>
                  4.0287
                              4.1637
                                       0.968
                                              0.33757
## Race^7
                 10.6546
                              4.1637
                                       2.559
                                              0.01334 *
                                       0.103
## Race<sup>8</sup>
                              4.1637
                  0.4296
                                              0.91820
## Race<sup>9</sup>
                 11.8432
                              4.1637
                                       2.844
                                               0.00627 **
                                       0.639
## Race^10
                  2.6623
                              4.1637
                                              0.52527
## Race^11
                 20.4962
                              4.1637
                                       4.923 8.43e-06 ***
                 -4.1603
                              4.1637
## Race^12
                                       -0.999 0.32217
## Race^13
                 -6.9000
                              4.1637
                                      -1.657
                                              0.10328
## Race^14
                -22.6336
                              4.1637
                                      -5.436 1.34e-06 ***
## Race^15
                 10.2721
                                       2.467
                                              0.01683 *
                              4.1637
## Race^16
                 -9.0701
                              4.1637
                                       -2.178
                                               0.03376 *
                 13.8811
                                       3.334 0.00155 **
## Race^17
                              4.1637
##
  ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 8.327 on 54 degrees of freedom
## Multiple R-squared: 0.649, Adjusted R-squared: 0.5386
## F-statistic: 5.874 on 17 and 54 DF, p-value: 2.732e-07
```

The result shows that race number has significant effect, this is intuitive.

summary(lm(race\_no\_aov))

Comment \* Here the baseline is race 18. So positive means the time significant higher than race 18. race 18 is MC \* When we treat time series as round, the difference is between round is not significant but if we treat single race as a ordered categorical data, then the series effect exist. \* When we look into the ordered categorical result, it shows that race 1-6 have no significant improvement but in 7-9 positive effect appears and so did in race 11. With time going by we can see concentration goes down and negative effect shows up. But meanwhile there's improvement in the tail. But then we can look into each race significant effect. \* 7, 9, 11, 15, 17  $\sim$  RR, MMM, RR, MMM, RR. These race makes the time goes down. \* 14, 16  $\sim$  RR, MMM. These race makes the time goes up. \* Maybe the race RR and MMM is more difficult or easier?

```
##
## Call:
## lm(formula = race_no_aov)
##
## Residuals:
##
      Min
               1Q Median
                                3Q
                                       Max
## -13.730 -4.750 -1.537
                             4.884 24.770
##
## Coefficients:
##
                  Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                   141.164
                                1.544 91.427 < 2e-16 ***
                   -5.864
                                2.184 -2.685 0.00907 **
## 'Race Name'MMM
                   -22.790
## 'Race Name'RR
                                2.184 -10.437 7.77e-16 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 7.564 on 69 degrees of freedom
## Multiple R-squared: 0.63, Adjusted R-squared: 0.6193
## F-statistic: 58.74 on 2 and 69 DF, p-value: 1.267e-15
MMM and RR seems easier.
Consider the player effect
race_no_aov <- aov(`Completion Time(s)` ~ Round + Player, data=Mdata)</pre>
summary(race_no_aov)
##
              Df Sum Sq Mean Sq F value
                                           Pr(>F)
## Round
                5
                      95
                            18.9
                                 0.147 0.980322
                3
## Player
                    2455
                           818.4
                                   6.350 0.000787 ***
## Residuals
               63
                   8120
                           128.9
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
summary(lm(race_no_aov))
##
## Call:
## lm(formula = race_no_aov)
##
## Residuals:
                1Q Median
                                3Q
                                       Max
## -19.633 -9.448
                     2.222
                             9.111 17.473
##
## Coefficients:
                   Estimate Std. Error t value Pr(>|t|)
                                4.0139 31.622 < 2e-16 ***
## (Intercept)
                   126.9283
## Round2
                     2.9150
                                4.6349
                                        0.629 0.531670
## Round3
                     0.1392
                                4.6349
                                        0.030 0.976141
## Round4
                     0.5575
                                4.6349
                                        0.120 0.904641
## Round5
                     1.7850
                                4.6349
                                       0.385 0.701443
```

```
## Round6
                    2.5033
                               4.6349
                                        0.540 0.591026
## PlayerJincheng
                    2.2017
                               3.7844
                                       0.582 0.562790
## PlayerJosephine -1.8967
                               3.7844 -0.501 0.617987
## PlayerSungmin
                   13.1650
                               3.7844
                                        3.479 0.000919 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 11.35 on 63 degrees of freedom
## Multiple R-squared: 0.239, Adjusted R-squared: 0.1423
## F-statistic: 2.473 on 8 and 63 DF, p-value: 0.02127
```

When consider the player effect, the completion time still not relavant to the round. But we can see due to the experience, Sungmin played not well in the test.

### Check race# and player effect

```
race_no_aov <- aov(`Completion Time(s)` ~ Race + Player, data=Mdata)</pre>
summary(race_no_aov)
##
               Df Sum Sq Mean Sq F value
                                            Pr(>F)
                           407.4
                                   16.11 7.18e-15 ***
## Race
               17
                    6925
                                    32.37 7.38e-12 ***
## Player
                3
                    2455
                           818.4
## Residuals
               51
                    1289
                            25.3
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
summary(lm(race_no_aov))
##
## Call:
## lm(formula = race_no_aov)
##
## Residuals:
##
       Min
                1Q Median
                                 3Q
                                        Max
## -8.4683 -3.6312 0.1467 2.6319 12.1075
##
## Coefficients:
##
                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                   128.2450
                                1.1852 108.208 < 2e-16 ***
## Race.L
                                        0.995 0.324242
                     2.5026
                                 2.5141
                                        1.243 0.219687
## Race.Q
                     3.1241
                                2.5141
## Race.C
                    -2.3216
                                2.5141 -0.923 0.360134
## Race<sup>4</sup>
                                        2.550 0.013830 *
                     6.4103
                                 2.5141
## Race<sup>5</sup>
                     3.7108
                                2.5141
                                        1.476 0.146101
## Race<sup>6</sup>
                     4.0287
                                2.5141 1.602 0.115235
## Race^7
                    10.6546
                                2.5141 4.238 9.47e-05 ***
                                2.5141 0.171 0.864991
## Race^8
                     0.4296
## Race^9
                    11.8432
                                2.5141
                                        4.711 1.94e-05 ***
## Race^10
                    2.6623
                                2.5141 1.059 0.294623
## Race^11
                    20.4962
                                2.5141 8.152 8.40e-11 ***
## Race^12
                    -4.1603
                                2.5141 -1.655 0.104118
```

```
## Race^13
                   -6.9000
                               2.5141 -2.744 0.008347 **
## Race^14
                               2.5141 -9.003 4.09e-12 ***
                   -22.6336
## Race^15
                   10.2721
                               2.5141
                                       4.086 0.000156 ***
## Race^16
                   -9.0701
                               2.5141 -3.608 0.000703 ***
## Race^17
                   13.8811
                               2.5141
                                        5.521 1.14e-06 ***
                                        1.314 0.194869
## PlayerJincheng
                               1.6761
                    2.2017
## PlayerJosephine -1.8967
                               1.6761 -1.132 0.263095
## PlayerSungmin
                   13.1650
                               1.6761
                                       7.855 2.45e-10 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 5.028 on 51 degrees of freedom
## Multiple R-squared: 0.8792, Adjusted R-squared: 0.8318
## F-statistic: 18.55 on 20 and 51 DF, p-value: < 2.2e-16
```

- The conclusion is similar to before, but more race shows significant effect.
  - -4, 7, 9, 11, 15,  $17 \sim MMM$ , RR, MMM, RR, MMM, RR. These race makes the time goes down.
  - 13, 14, 16  $\sim$  MC, RR, MMM. These race makes the time goes up.

#### Check the whole model

```
whole_aov <- aov(`Completion Time(s)` ~ Round + Vehicle + `Race Name` + Player, data=Mdata)
summary(whole_aov)
##
              Df Sum Sq Mean Sq F value
                                          Pr(>F)
## Round
               5
                     95
                              19
                                  0.783 0.56635
## Vehicle
               5
                    429
                              86
                                  3.552 0.00736 **
## 'Race Name'
               2
                   6339
                            3169 131.213 < 2e-16 ***
## Player
                            818 33.883 1.27e-12 ***
               3
                   2455
## Residuals
                   1353
                              24
              56
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Interaction between cars and blocks

```
whole_inter_aov <- aov(`Completion Time(s)` ~ Vehicle * (as.factor(Round) + Player + `Race Name`), data
summary(whole_inter_aov)</pre>
```

```
##
                            Df Sum Sq Mean Sq F value
                                                         Pr(>F)
## Vehicle
                              5
                                   430
                                            86
                                                 3.193 0.070440 .
                              5
                                    93
## as.factor(Round)
                                            19
                                                 0.694 0.642961
## Player
                              3
                                  2455
                                           818 30.384 0.000101 ***
## 'Race Name'
                              2
                                  6339
                                          3169 117.661 1.17e-06 ***
## Vehicle:as.factor(Round) 24
                                            23
                                                 0.854 0.644295
                                   552
## Vehicle:Player
                             14
                                   393
                                            28
                                                 1.043 0.496960
## Vehicle: 'Race Name'
                            10
                                   192
                                            19
                                                 0.713 0.697654
## Residuals
                             8
                                   215
                                            27
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
```

The interaction is not significant but the Player and Race Nmae play a role in the response variable.