# Preliminary Data Screening

Kaleem Ullah

2024-03-15

## Check the percentage of videos that were played

```
video_data <- read.csv("video_data_flattened.csv", header=TRUE)
num_ppn <- length(unique(video_data$ppn))
df_recog <- read.csv("emotion_recog.csv", header=TRUE)
df_iden <- read.csv("emotion_iden.csv", header=TRUE)
expected_played <- num_ppn*24
videos_played <- length(video_data$ppn)</pre>
```

Expected videos played: 4176 Total videos played: 3802 Percentage of videos played: 91.0440613

### Check individually for each task

1. Recognition Task

#### Videos Played

```
zoneType <- df_recog$Zone.Type
last_iter = "response_button_text"
unplayed = 0
for (i in zoneType){
   if (last_iter == "response_button_text" & i == "response_button_text") {
      unplayed = unplayed + 1
   }
   last_iter = i
}
unplayed</pre>
```

## [1] 222

#### Reaction Time

```
reac_recog <- sum(video_data$reaction.recog < 1000, na.rm=TRUE)</pre>
```

Percentage of videos played less than 1 second: 52.7880063

2. Identification Task

```
reac_iden <- sum(video_data$reaction.iden < 1000, na.rm=TRUE)
```

Percentage of videos played less than 1 second: 53.3403472

#### Time Taken for each task

```
total_time_recog <- as.numeric(df_recog[df_recog$Trial.Number == "END TASK",]$Reaction.Time) / 1000 total_time_iden <- as.numeric(df_iden[df_iden$Trial.Number == "END TASK",]$Reaction.Time) / 1000
```

1. Recognition Task

```
summary(total_time_recog)
##
                                Mean 3rd Qu.
      Min. 1st Qu.
                     Median
                                                 Max.
##
     25.42 170.66
                     219.18
                              264.14
                                      296.95 1815.12
sort(total_time_recog)
     [1]
                                         91.040
                                                            98.448
                                                                      98.596
##
           25.422
                     31.380
                               45.046
                                                  96.196
                                                                                99.272
##
     [9]
          104.617
                    107.342
                                       111.775
                                                 115.758
                                                           119.523
                                                                     121.568
                                                                              122.775
                              111.155
##
    [17]
          128.081
                    128.367
                              129.331
                                       129.646
                                                 135.577
                                                           137.616
                                                                     138.455
                                                                              138.739
##
    [25]
          142.918
                    143.230
                              150.596
                                       150.994
                                                 151.013
                                                           151.856
                                                                     152.826
                                                                              153.897
##
    [33]
          155.782
                    158.933
                              161.435
                                       163.218
                                                 163.511
                                                           164.371
                                                                     165.455
                                                                              166.600
    [41]
          168.411
                    168.509
                              168.671
                                       169.105
                                                 170.249
                                                           171.065
                                                                     171.897
##
                                                                              173.488
##
    [49]
          175.949
                    178.825
                              180.430
                                       184.543
                                                 184.918
                                                           185.819
                                                                     186.579
                                                                              187.301
##
    [57]
          188.599
                    189.077
                              190.421
                                       190.748
                                                 191.345
                                                           191.644
                                                                     192.511
                                                                              194.451
                                                                              201.348
##
    [65]
          194.517
                    197.281
                              198.404
                                       199.389
                                                 200.454
                                                           200.693
                                                                     201.052
##
    [73]
          201.997
                    202.299
                              202.639
                                       203.629
                                                 204.323
                                                           204.339
                                                                     206.078
                                                                              207.159
    [81]
                                                 212.609
                                                           213.867
                                                                     217.691
                                                                              217.871
##
          207.639
                    208.773
                              209.117
                                       212.359
##
    [89]
          217.996
                    219.175
                              219.479
                                       219.566
                                                 220.208
                                                           220.897
                                                                     222.238
                                                                              222.494
                                       230.694
   [97]
                    227.377
                              227.993
                                                 232.241
                                                           234.132
##
          226.693
                                                                     236.941
                                                                              238.428
## [105]
          238.732
                    243.662
                              244.315
                                       245.208
                                                 245.882
                                                           246.494
                                                                     246.524
                                                                              247.029
##
  [113]
          247.033
                    247.822
                              248.763
                                       250.711
                                                 251.103
                                                           251.666
                                                                     252.270
                                                                              253.500
  [121]
          257.019
                    258.191
                              262.869
                                       263.864
                                                 265.258
                                                           265.827
                                                                     268.261
                                                                              269.695
## [129]
          271.605
                    280.823
                              281.466
                                       284.930
                                                 292.694
                                                           296.209
                                                                     297.698
                                                                              301.737
## [137]
                                       308.144
                                                 316.431
                                                           316.729
                                                                     319.790
          304.419
                    305.480
                              306.155
                                                                              322.622
## [145]
          326.810
                    334.347
                              334.647
                                       334.760
                                                 337.818
                                                           338.576
                                                                     339.439
                                                                              341.709
                              361.520
## [153]
          347.387
                    358.188
                                       361.950
                                                 375.457
                                                           389.208
                                                                     389.507
                                                                              392.982
## [161]
          396.023
                    397.512
                              400.795
                                       412.057
                                                 414.828
                                                           415.081
                                                                     430.047
                                                                              469.989
## [169]
          472.437
                    473.420
                              484.781
                                       496.328
                                                 526.559
                                                           537.140
                                                                     607.232
                                                                              760.812
## [177] 1584.184 1684.825 1815.116
```

2. Identification Task

```
summary(total_time_iden)
```

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 15.38 141.25 187.58 220.41 238.95 1102.60
```

```
sort(total_time_iden)
##
    [1]
         15.375 32.619 33.482 49.708
                                          51.679
                                                 62.428
                                                           77.437
                                                                   78.599
##
    [9]
         79.975
                 83.865
                          87.290
                                  88.349
                                          88.696
                                                  90.020
                                                           90.913
                                                                   92.681
##
   [17]
                 94.540 100.328 101.144 101.585 102.332 105.150 107.472
         93.115
  [25] 107.538 108.882 112.977 118.110 118.580 118.722 119.439 119.469
## [33] 119.485 120.541 123.124 126.182 126.550 127.969 128.030 128.552
##
   [41] 131.204 134.952 136.407 138.213 139.260 143.242
                                                          143.643 144.493
## [49] 145.434 145.664 146.034 149.096 150.942 151.285
                                                          151.500 153.553
## [57] 155.474 156.478 157.020 161.188 161.749 163.131 163.386 164.003
## [65] 164.024 166.810 167.132 168.770 169.548 170.579
                                                         172.627 174.414
##
   [73] 174.442 174.596 175.458 175.808 176.246 176.940 177.509 177.972
## [81] 179.644 180.493 180.495 180.820 182.026 182.118 184.496 184.825
## [89] 186.491 187.579 188.820 188.830 190.553 190.751 191.234 192.893
## [97] 193.784 194.745 198.627 200.524 202.230 202.506
                                                          205.985 207.269
## [105] 207.977 208.197 209.474 209.697 210.527 210.916
                                                          213.676 215.794
## [113] 217.136 218.429 219.431 219.506 219.987 221.210
                                                          221.734 223.637
## [121] 225.605 225.657 225.987 226.131 228.561 230.500
                                                          234.159 234.215
## [129] 234.458 236.278 236.313 237.938 238.245 238.417
                                                          239.480 239.485
## [137] 239.685 239.925 240.694 245.426 248.366 251.326
                                                          253.223 262.647
## [145] 262.782 267.613 268.929 271.070 281.173 282.005
                                                          282.442 285.649
## [153] 289.841 291.008 315.167 323.961 328.524 331.971
                                                          335.538
                                                                  351.566
## [161] 355.338 378.736 381.506 386.006 390.017
                                                 395.798
                                                          422.499
                                                                  422.718
## [169] 453.505 459.580 460.937 470.820 520.955 606.520
                                                          615.076 908.653
## [177] 1009.096 1022.720 1102.595
```

# Preliminary Analyses

```
accuracy_fit_2 <- glmer(accuracy ~ culture + (1 | ppn1/emotion),</pre>
                      data = df,
                      family = binomial,
                      control = glmerControl(optimizer = "bobyqa"))
## boundary (singular) fit: see help('isSingular')
summary(accuracy_fit_1)
## Generalized linear mixed model fit by maximum likelihood (Adaptive
    Gauss-Hermite Quadrature, nAGQ = 10) [glmerMod]
## Family: binomial ( logit )
## Formula: accuracy ~ culture + (1 | ppn1)
     Data: df
## Control: glmerControl(optimizer = "bobyqa")
##
##
                BIC logLik deviance df.resid
        AIC
##
     3905.2
             3930.4 -1948.6
                               3897.2
##
## Scaled residuals:
      Min
               1Q Median
                               3Q
##
                                      Max
## -0.5206 -0.5206 -0.4676 -0.4595 2.1763
##
## Random effects:
## Groups Name
                       Variance Std.Dev.
## ppn1 (Intercept) 0
## Number of obs: 4029, groups: ppn1, 173
##
## Fixed effects:
##
              Estimate Std. Error z value Pr(>|z|)
## (Intercept) -1.52047 0.07096 -21.427
                                            <2e-16 ***
                                            0.0276 *
## cultureCN
              0.21481
                          0.09752 2.203
## cultureNL
             -0.03476
                          0.10094 -0.344
                                           0.7306
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Correlation of Fixed Effects:
##
             (Intr) cltrCN
## cultureCN -0.728
## cultureNL -0.703 0.512
## optimizer (bobyqa) convergence code: 0 (OK)
## boundary (singular) fit: see help('isSingular')
summary(accuracy_fit_2)
## Generalized linear mixed model fit by maximum likelihood (Laplace
     Approximation) [glmerMod]
## Family: binomial ( logit )
## Formula: accuracy ~ culture + (1 | ppn1/emotion)
     Data: df
## Control: glmerControl(optimizer = "bobyqa")
```

```
##
##
       AIC
                BIC
                     logLik deviance df.resid
             3719.8 -1839.1
##
    3688.3
                              3678.3
##
## Scaled residuals:
           1Q Median
##
      Min
                               3Q
                                      Max
## -0.9636 -0.2904 -0.2510 -0.2461 2.0044
##
## Random effects:
## Groups
                            Variance Std.Dev.
                Name
## emotion:ppn1 (Intercept) 2.657
                (Intercept) 0.000
                                     0.00
## Number of obs: 4029, groups: emotion:ppn1, 1377; ppn1, 173
##
## Fixed effects:
              Estimate Std. Error z value Pr(>|z|)
##
## (Intercept) -2.24920
                          0.12151 -18.510
                                            <2e-16 ***
                          0.11414 2.556
## cultureCN
              0.29170
                                            0.0106 *
## cultureNL
             -0.03903
                          0.11707 -0.333 0.7388
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Correlation of Fixed Effects:
             (Intr) cltrCN
## cultureCN -0.531
## cultureNL -0.474 0.507
## optimizer (bobyqa) convergence code: 0 (OK)
## boundary (singular) fit: see help('isSingular')
anova(accuracy_fit_1, accuracy_fit_2)
## Data: df
## Models:
## accuracy_fit_1: accuracy ~ culture + (1 | ppn1)
## accuracy_fit_2: accuracy ~ culture + (1 | ppn1/emotion)
                         AIC
                                BIC logLik deviance Chisq Df Pr(>Chisq)
                 npar
## accuracy_fit_1
                   4 3905.2 3930.4 -1948.6
                                             3897.2
                                              3678.3 218.91 1 < 2.2e-16 ***
## accuracy_fit_2
                    5 3688.3 3719.8 -1839.1
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
# Hypothesis 2
iden_fit <- lmer(likert1 ~ culture + (1 | ppn1),</pre>
                data=df)
summary(iden_fit)
## Linear mixed model fit by REML ['lmerMod']
## Formula: likert1 ~ culture + (1 | ppn1)
##
     Data: df
##
## REML criterion at convergence: 18135.4
## Scaled residuals:
```

```
1Q Median
                                3Q
## -3.4312 -0.6364 -0.0764 0.6167 3.2295
##
## Random effects:
## Groups Name
                         Variance Std.Dev.
             (Intercept) 2.608
                                  1.615
## ppn1
                         4.708
                                  2.170
## Residual
## Number of obs: 4029, groups: ppn1, 173
##
## Fixed effects:
               Estimate Std. Error t value
## (Intercept) 4.09109
                           0.13637
                                    29.999
                0.03728
                           0.08387
## cultureCN
                                     0.445
## cultureNL
                0.22590
                           0.08360
                                     2.702
##
## Correlation of Fixed Effects:
##
             (Intr) cltrCN
## cultureCN -0.305
## cultureNL -0.307 0.498
# Hypothesis 3
glm_fit <- glmer(accuracy ~ culture + likert1 + (1 | ppn1),</pre>
                 data = df,
                 family = binomial,
                 control = glmerControl(optimizer = "bobyqa"),
                 nAGQ = 10)
## boundary (singular) fit: see help('isSingular')
glm_fit_2 <- glmer(accuracy ~ culture + likert1 + (1 | ppn1),</pre>
                 data = df,
                 family = binomial)
## boundary (singular) fit: see help('isSingular')
summary(glm_fit)
## Generalized linear mixed model fit by maximum likelihood (Adaptive
    Gauss-Hermite Quadrature, nAGQ = 10) [glmerMod]
## Family: binomial (logit)
## Formula: accuracy ~ culture + likert1 + (1 | ppn1)
##
      Data: df
## Control: glmerControl(optimizer = "bobyqa")
##
##
        AIC
                 BIC
                      logLik deviance df.resid
              3928.1 -1943.3
##
     3896.6
                                3886.6
                                           4024
##
## Scaled residuals:
       Min
                1Q Median
                                3Q
## -0.5991 -0.5004 -0.4659 -0.4220 2.4245
## Random effects:
```

```
## Groups Name
                      Variance Std.Dev.
          (Intercept) 5.666e-16 2.38e-08
## ppn1
## Number of obs: 4029, groups: ppn1, 173
## Fixed effects:
##
              Estimate Std. Error z value Pr(>|z|)
## (Intercept) -1.72567
                          0.09620 -17.938 < 2e-16 ***
                                   2.191 0.02846 *
## cultureCN
              0.21395
                          0.09765
                          0.10113 -0.451 0.65197
## cultureNL
              -0.04561
## likert1
              0.04872
                          0.01499
                                    3.249 0.00116 **
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Correlation of Fixed Effects:
##
            (Intr) cltrCN cltrNL
## cultureCN -0.537
## cultureNL -0.496 0.511
## likert1 -0.674 0.000 -0.034
## optimizer (bobyqa) convergence code: 0 (OK)
## boundary (singular) fit: see help('isSingular')
summary(glm_fit_2)
## Generalized linear mixed model fit by maximum likelihood (Laplace
    Approximation) [glmerMod]
## Family: binomial (logit)
## Formula: accuracy ~ culture + likert1 + (1 | ppn1)
##
     Data: df
##
##
       AIC
                BIC logLik deviance df.resid
##
    3896.6 3928.1 -1943.3
                               3886.6
                                          4024
## Scaled residuals:
      Min
              1Q Median
                               3Q
## -0.5991 -0.5004 -0.4659 -0.4220 2.4245
## Random effects:
## Groups Name
                      Variance Std.Dev.
## ppn1 (Intercept) 0
## Number of obs: 4029, groups: ppn1, 173
##
## Fixed effects:
              Estimate Std. Error z value Pr(>|z|)
##
## (Intercept) -1.72567
                          0.09620 -17.938 < 2e-16 ***
## cultureCN
              0.21395
                          0.09765
                                    2.191 0.02846 *
## cultureNL
              -0.04561
                          0.10113 -0.451 0.65197
## likert1
               0.04872
                          0.01499
                                    3.249 0.00116 **
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Correlation of Fixed Effects:
##
            (Intr) cltrCN cltrNL
## cultureCN -0.537
## cultureNL -0.496 0.511
```

```
## likert1 -0.674 0.000 -0.034
## optimizer (Nelder_Mead) convergence code: 0 (OK)
## boundary (singular) fit: see help('isSingular')
```