Analyses for JSLHR version

2020-10-17

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History:

- 2020-08-05 final first version
- 2020-10-10 (rehaul),
- latest minor edits 2020-10-17

TODO:

- pipeline is still not transparent
- there are duplicate files across raw and derived data
- there are a bunch of files with similar names
- README is old
- a note said read demo data created by AC from info in paper should be replaced with real demo data

Read data in

```
# read datasets

demo_data=read.csv("../Derived_Data/demo-data.tsv",sep="\t")
data_ang <- read.csv("../Derived_Data/classifications_PU_zoon_final17.csv",header=T,sep=",")
data_td <- read.csv("../Derived_Data/classifications_PU_zoon_final.csv")
data_all<-rbind(data_ang, data_td)

#add filenames to demo data
demo_data_fn <- demo_data %>%
    left_join(select(data_all, filename, ChildID), by = c("ChildID"))
```

```
## Warning: Column `ChildID` joining factors with different levels, coercing to
## character vector

demo_data_fn<-unique(demo_data_fn)

#remove the word mixed that takes up space and is unnecessary
data_all$Zoon_classif=factor(gsub("Mixed_","",as.character(data_all$Zoon_classif),fixed=T))
#relevel the factor so that it's easier to read
data_all$Zoon_classif=factor(data_all$Zoon_classif, levels=c("Canonical","Non-Canonical",
# create lab column with easier to read correspondance
data_all$lab<-as.character(data_all$Major_Choice)
data_all$lab[data_all$lab=="Non-canonical syllables"]<-"Non-Canonical"
data_all$lab[data_all$lab=="Canonical syllables"]<-"Canonical"
data_all$lab[data_all$lab="Canonical syllables"]<-"Canonical"
data_all$lab[data_all$lab,levels=levels(data_all$Zoon_classif))
#apply same factor levels as zooniverse so that we can do symmetrical confusion matrices</pre>
```

Correspondence between lab & zooniverse annotation at the level of segments

Here we look at to what extent zooniverse and lab annotations match at the level of individual segments. Each data point is one segment (one "vocalization").

```
table(data_all$lab)
##
                        Canonical
                                                    Non-Canonical
##
##
                              1779
                                                              6423
                            Crying
##
                                                          Laughing
##
                               588
                                                               186
                              Junk
##
                                                 Canonical_Crying
                              2595
##
               Canonical_Laughing
##
                                                 Crying_Canonical
##
##
       Crying_Canonical_Laughing
                                                  Crying_Laughing
##
                                                                  0
##
   Crying_Laughing_Non-Canonical
                                             Crying_Non-Canonical
##
##
   Crying_Non-Canonical_Laughing
                                                  Laughing_Crying
##
##
          Laughing_Non-Canonical Laughing_Non-Canonical_Crying
##
##
             Non-Canonical_Crying
                                           Non-Canonical_Laughing
##
table(data_all$Zoon_classif)
##
                                                    Non-Canonical
##
                        Canonical
##
                              1665
                                                              5525
##
                            Crying
                                                          Laughing
##
                               920
                                                               442
##
                              Junk
                                                 Canonical_Crying
##
                              1456
##
               Canonical_Laughing
                                                 Crying_Canonical
##
                                15
```

```
##
       Crying_Canonical_Laughing
                                                  Crying_Laughing
##
                                                               108
## Crying_Laughing_Non-Canonical
                                             Crying Non-Canonical
                                                               655
##
## Crying_Non-Canonical_Laughing
                                                  Laughing_Crying
##
##
          Laughing_Non-Canonical Laughing_Non-Canonical_Crying
##
                               124
                                          Non-Canonical_Laughing
##
            Non-Canonical_Crying
##
                               338
                                                               211
mycf=confusionMatrix(data_all$lab, data_all$Zoon_classif, dnn = c("Lab","Zooniverse"))
conf_tab=mycf$table
# this package uses sensitivity & specificity
#Sensitivity=recall
#Specificity=precision
mycf
  Confusion Matrix and Statistics
##
##
                                    Zooniverse
## Lab
                                     Canonical Non-Canonical Crying Laughing Junk
##
     Canonical
                                           1014
                                                           524
                                                                   31
                                                                             29
                                                                                  79
##
     Non-Canonical
                                            255
                                                          4176
                                                                  536
                                                                            154
                                                                                 360
                                              6
                                                                  239
                                                                              8
##
     Crying
                                                            32
                                                                                   6
                                              2
##
     Laughing
                                                            12
                                                                    8
                                                                            115
                                                                                   6
                                            372
                                                                            136 1005
##
     Junk
                                                           776
                                                                  106
##
     Canonical_Crying
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Canonical_Laughing
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Crying Canonical
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Crying_Canonical_Laughing
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Crying_Laughing
                                              0
##
     Crying_Laughing_Non-Canonical
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Crying Non-Canonical
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Crying_Non-Canonical_Laughing
##
     Laughing_Crying
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
                                                             0
                                                                    0
                                                                              0
##
                                              0
                                                                                   0
     Laughing_Non-Canonical
##
     Laughing_Non-Canonical_Crying
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Non-Canonical_Crying
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
     Non-Canonical_Laughing
                                              0
                                                             0
                                                                    0
                                                                              0
                                                                                   0
##
                                    Zooniverse
## Lab
                                     Canonical_Crying Canonical_Laughing
##
     Canonical
                                                     0
                                                                          2
     Non-Canonical
                                                     3
##
                                                                          5
                                                     0
                                                                          0
##
     Crying
##
     Laughing
                                                     0
                                                                          0
##
     Junk
                                                     0
                                                                          8
##
     Canonical_Crying
                                                     0
                                                                          0
                                                     0
                                                                          0
##
     Canonical_Laughing
##
     Crying_Canonical
                                                     0
                                                                          0
##
     Crying_Canonical_Laughing
                                                     0
                                                                          0
##
                                                     0
                                                                          0
     Crying_Laughing
##
     Crying_Laughing_Non-Canonical
                                                     0
                                                                          0
                                                     0
##
     Crying_Non-Canonical
                                                                          0
     Crying_Non-Canonical_Laughing
```

```
Laughing_Crying
                                                     0
                                                                         0
##
                                                                         0
##
     Laughing_Non-Canonical
                                                     0
     Laughing_Non-Canonical_Crying
                                                     0
##
                                                                         0
##
     Non-Canonical_Crying
                                                     0
                                                                         0
     Non-Canonical_Laughing
                                                     0
##
                                                                         0
                                    Zooniverse
##
                                     Crying_Canonical Crying_Canonical_Laughing
## Lab
##
                                                    21
     Canonical
##
     Non-Canonical
                                                     5
                                                                                0
##
     Crying
                                                     1
                                                                                0
                                                     0
##
     Laughing
                                                                                0
##
     Junk
                                                     2
                                                                                0
##
     Canonical_Crying
                                                     0
                                                                                0
##
                                                     0
                                                                                0
     Canonical_Laughing
     Crying_Canonical
##
                                                     0
                                                                                0
                                                     0
                                                                                0
##
     Crying_Canonical_Laughing
##
     Crying_Laughing
                                                     0
                                                                                0
                                                     0
                                                                                0
##
     Crying_Laughing_Non-Canonical
     Crying_Non-Canonical
                                                     0
                                                                                0
##
                                                     0
##
     Crying_Non-Canonical_Laughing
                                                                                0
##
     Laughing_Crying
                                                     0
                                                                                0
##
     Laughing Non-Canonical
                                                     0
                                                                                0
##
     Laughing_Non-Canonical_Crying
                                                     0
                                                                                0
##
     Non-Canonical Crying
                                                     0
                                                                                0
##
     Non-Canonical_Laughing
                                                     0
                                                                                0
##
                                    Zooniverse
## Lab
                                     Crying_Laughing Crying_Laughing_Non-Canonical
##
     Canonical
     Non-Canonical
                                                   32
                                                                                  16
##
##
                                                   48
                                                                                  50
     Crying
##
                                                   11
     Laughing
                                                                                   1
##
     Junk
                                                   15
                                                                                   6
##
     Canonical_Crying
                                                   0
                                                                                   0
                                                                                   0
##
     Canonical_Laughing
                                                    0
##
     Crying Canonical
                                                   0
                                                                                   0
     Crying_Canonical_Laughing
                                                                                   0
##
                                                    0
                                                                                   0
##
     Crying Laughing
                                                    0
##
     Crying_Laughing_Non-Canonical
                                                    0
                                                                                   0
     Crying_Non-Canonical
                                                                                   0
##
                                                    0
##
     Crying_Non-Canonical_Laughing
                                                    0
                                                                                   0
##
     Laughing Crying
                                                    0
                                                                                   0
##
     Laughing Non-Canonical
                                                    0
                                                                                   0
##
     Laughing_Non-Canonical_Crying
                                                    0
                                                                                   0
##
     Non-Canonical_Crying
                                                    0
                                                                                   0
##
     Non-Canonical_Laughing
                                                    0
##
                                    Zooniverse
## Lab
                                     Crying_Non-Canonical
##
     Canonical
                                                        34
     Non-Canonical
                                                       420
##
##
                                                       165
     Crying
##
     Laughing
                                                         1
                                                        35
##
     Junk
     Canonical_Crying
##
                                                         0
##
     Canonical Laughing
                                                         0
```

```
Crying Canonical
                                                         0
##
     Crying_Canonical_Laughing
                                                         0
##
     Crying Laughing
                                                         0
##
##
     Crying_Laughing_Non-Canonical
                                                         0
     Crying Non-Canonical
                                                         0
##
##
     Crying_Non-Canonical_Laughing
                                                         0
##
     Laughing Crying
                                                         0
     Laughing_Non-Canonical
                                                         0
##
##
     Laughing_Non-Canonical_Crying
                                                         0
##
     Non-Canonical_Crying
                                                         0
##
     Non-Canonical_Laughing
                                                         0
##
                                   Zooniverse
## Lab
                                     Crying_Non-Canonical_Laughing Laughing_Crying
##
     Canonical
##
     Non-Canonical
                                                                  4
                                                                                   5
##
     Crying
                                                                  1
                                                                                   1
##
     Laughing
                                                                  0
                                                                                   0
##
     Junk
                                                                                   1
##
     Canonical_Crying
                                                                                   0
     Canonical Laughing
                                                                                   0
##
                                                                  0
##
     Crying_Canonical
                                                                  0
                                                                                   0
##
     Crying_Canonical_Laughing
                                                                                   0
##
     Crying_Laughing
                                                                                   0
                                                                  0
     Crying_Laughing_Non-Canonical
##
                                                                  0
                                                                                   0
##
     Crying_Non-Canonical
                                                                                   0
                                                                  0
##
     Crying_Non-Canonical_Laughing
                                                                                   0
##
     Laughing_Crying
                                                                  0
                                                                                   0
##
     Laughing_Non-Canonical
                                                                  0
                                                                                   0
     Laughing_Non-Canonical_Crying
                                                                                   0
##
                                                                  0
##
     Non-Canonical_Crying
                                                                  0
                                                                                   0
##
     Non-Canonical_Laughing
                                                                                   0
##
                                   Zooniverse
## Lab
                                     Laughing_Non-Canonical
     Canonical
##
     Non-Canonical
                                                          62
##
                                                           5
##
     Crying
     Laughing
##
                                                           9
##
     Junk
                                                          30
     Canonical_Crying
##
                                                           0
##
     Canonical_Laughing
                                                           0
##
     Crying Canonical
     Crying_Canonical_Laughing
##
                                                           0
##
     Crying Laughing
##
     Crying_Laughing_Non-Canonical
                                                           0
##
     Crying_Non-Canonical
     Crying_Non-Canonical_Laughing
##
                                                           0
##
     Laughing_Crying
##
     Laughing_Non-Canonical
                                                           0
##
     Laughing_Non-Canonical_Crying
                                                           0
##
     Non-Canonical_Crying
                                                           0
##
     Non-Canonical_Laughing
                                                           0
##
                                   Zooniverse
## Lab
                                     Laughing_Non-Canonical_Crying
##
     Canonical
```

```
Non-Canonical
##
                                                                  4
     Crying
##
                                                                  3
     Laughing
##
                                                                  1
##
     Junk
                                                                  1
##
     Canonical_Crying
                                                                  0
##
     Canonical_Laughing
                                                                 0
##
     Crying Canonical
                                                                  0
     Crying_Canonical_Laughing
##
                                                                  0
##
     Crying_Laughing
                                                                  0
##
     Crying_Laughing_Non-Canonical
                                                                  0
##
     Crying_Non-Canonical
##
     Crying_Non-Canonical_Laughing
                                                                  0
##
     Laughing_Crying
                                                                  0
##
     Laughing_Non-Canonical
                                                                  0
##
     Laughing_Non-Canonical_Crying
                                                                  0
##
     Non-Canonical_Crying
                                                                  0
##
     Non-Canonical_Laughing
                                                                  0
##
                                   Zooniverse
## Lab
                                    Non-Canonical_Crying Non-Canonical_Laughing
     Canonical
##
     Non-Canonical
##
                                                      271
                                                                              115
##
     Crying
                                                       20
                                                                                3
##
     Laughing
                                                        0
                                                                               20
##
     Junk
                                                       39
                                                                               62
##
                                                        0
                                                                                0
     Canonical_Crying
##
     Canonical Laughing
                                                        0
                                                                                0
##
     Crying_Canonical
                                                        0
                                                                                0
##
     Crying_Canonical_Laughing
                                                        0
                                                                                0
                                                        0
##
     Crying_Laughing
                                                                                0
##
     Crying_Laughing_Non-Canonical
                                                        0
                                                                                0
##
     Crying_Non-Canonical
                                                        0
                                                                                0
##
     Crying_Non-Canonical_Laughing
                                                        0
                                                                                0
##
     Laughing_Crying
                                                        0
                                                                                0
                                                        0
##
     Laughing_Non-Canonical
                                                                                0
     Laughing_Non-Canonical_Crying
                                                        0
##
                                                                                0
     Non-Canonical_Crying
##
                                                        0
                                                                                0
     Non-Canonical_Laughing
##
                                                        0
                                                                                0
##
## Overall Statistics
##
##
                  Accuracy: 0.566
##
                    95% CI: (0.5569, 0.575)
##
       No Information Rate: 0.4771
##
       P-Value [Acc > NIR] : < 2.2e-16
##
##
                     Kappa: 0.3621
##
##
   Mcnemar's Test P-Value : NA
##
## Statistics by Class:
##
##
                         Class: Canonical Class: Non-Canonical Class: Crying
## Sensitivity
                                  0.61492
                                                         0.7565
                                                                       0.25978
## Specificity
                                  0.92290
                                                         0.6287
                                                                       0.96723
```

```
## Pos Pred Value
                                  0.56998
                                                         0.6502
                                                                      0.40646
## Neg Pred Value
                                  0.93515
                                                         0.7389
                                                                      0.93800
## Prevalence
                                  0.14251
                                                         0.4771
                                                                      0.07951
## Detection Rate
                                  0.08763
                                                         0.3609
                                                                      0.02066
## Detection Prevalence
                                  0.15375
                                                         0.5551
                                                                       0.05082
## Balanced Accuracy
                                                         0.6926
                                  0.76891
                                                                      0.61351
                        Class: Laughing Class: Junk Class: Canonical_Crying
## Sensitivity
                                0.260181
                                             0.69025
                                                                    0.0000000
## Specificity
                                0.993620
                                             0.84281
                                                                    1.0000000
## Pos Pred Value
                                0.618280
                                             0.38728
                                                                           NaN
## Neg Pred Value
                                0.971278
                                             0.94975
                                                                    0.9997407
## Prevalence
                                                                    0.0002593
                                0.038199
                                             0.12583
## Detection Rate
                                0.009939
                                             0.08686
                                                                    0.0000000
## Detection Prevalence
                                0.016075
                                             0.22427
                                                                    0.0000000
## Balanced Accuracy
                                0.626901
                                             0.76653
                                                                    0.5000000
##
                         Class: Canonical_Laughing Class: Crying_Canonical
                                          0.000000
## Sensitivity
                                                                   0.000000
                                          1.000000
## Specificity
                                                                   1.000000
## Pos Pred Value
                                               NaN
                                                                         NaN
## Neg Pred Value
                                          0.998704
                                                                   0.997494
## Prevalence
                                          0.001296
                                                                   0.002506
## Detection Rate
                                          0.000000
                                                                   0.00000
## Detection Prevalence
                                          0.000000
                                                                   0.000000
## Balanced Accuracy
                                          0.500000
                                                                   0.500000
##
                        Class: Crying_Canonical_Laughing Class: Crying_Laughing
## Sensitivity
                                                0.0000000
                                                                          0.00000
## Specificity
                                                 1.0000000
                                                                          1.000000
## Pos Pred Value
                                                       NaN
                                                                               NaN
## Neg Pred Value
                                                0.9998272
                                                                          0.990666
## Prevalence
                                                 0.0001728
                                                                          0.009334
## Detection Rate
                                                 0.0000000
                                                                          0.000000
## Detection Prevalence
                                                 0.0000000
                                                                          0.000000
## Balanced Accuracy
                                                 0.5000000
                                                                          0.500000
##
                        Class: Crying_Laughing_Non-Canonical
## Sensitivity
                                                      0.00000
                                                      1.000000
## Specificity
## Pos Pred Value
                                                           NaN
## Neg Pred Value
                                                      0.993518
## Prevalence
                                                      0.006482
## Detection Rate
                                                      0.00000
## Detection Prevalence
                                                      0.000000
## Balanced Accuracy
                                                      0.500000
                        Class: Crying_Non-Canonical
## Sensitivity
                                             0.00000
                                             1.00000
## Specificity
## Pos Pred Value
                                                  NaN
## Neg Pred Value
                                             0.94339
## Prevalence
                                             0.05661
## Detection Rate
                                             0.00000
## Detection Prevalence
                                             0.00000
## Balanced Accuracy
                                             0.50000
                        Class: Crying Non-Canonical Laughing
## Sensitivity
                                                      0.000000
## Specificity
                                                      1.000000
```

```
## Pos Pred Value
                                                           NaN
## Neg Pred Value
                                                      0.999395
## Prevalence
                                                      0.000605
## Detection Rate
                                                      0.00000
## Detection Prevalence
                                                      0.00000
## Balanced Accuracy
                                                      0.500000
                         Class: Laughing_Crying Class: Laughing_Non-Canonical
                                      0.0000000
## Sensitivity
                                                                        0.00000
## Specificity
                                      1.0000000
                                                                        1.00000
## Pos Pred Value
                                            NaN
                                                                            NaN
## Neg Pred Value
                                      0.9993086
                                                                        0.98928
## Prevalence
                                      0.0006914
                                                                        0.01072
## Detection Rate
                                      0.0000000
                                                                        0.00000
## Detection Prevalence
                                      0.000000
                                                                        0.00000
## Balanced Accuracy
                                      0.5000000
                                                                        0.50000
##
                         Class: Laughing_Non-Canonical_Crying
                                                     0.000000
## Sensitivity
## Specificity
                                                     1.000000
## Pos Pred Value
                                                           NaN
## Neg Pred Value
                                                     0.9992222
## Prevalence
                                                     0.0007778
## Detection Rate
                                                     0.0000000
## Detection Prevalence
                                                     0.0000000
## Balanced Accuracy
                                                     0.5000000
##
                         Class: Non-Canonical_Crying Class: Non-Canonical_Laughing
## Sensitivity
                                              0.00000
                                                                             0.00000
## Specificity
                                              1.00000
                                                                             1.00000
## Pos Pred Value
                                                  NaN
                                                                                 NaN
## Neg Pred Value
                                              0.97079
                                                                             0.98176
## Prevalence
                                              0.02921
                                                                             0.01824
## Detection Rate
                                              0.00000
                                                                             0.00000
## Detection Prevalence
                                              0.00000
                                                                             0.00000
## Balanced Accuracy
                                              0.50000
                                                                             0.50000
```

Precision

Precision means: If a segment was called X by zooniverse coders, what proportion of the time was it called X by lab coders?

```
colsums=colSums(conf_tab)
my_conf_tab=conf_tab
for(i in 1:18) my_conf_tab[,i]=my_conf_tab[,i]/colsums[i]
colSums(my_conf_tab)
```

```
##
                         Canonical
                                                     Non-Canonical
##
                                  1
##
                            Crying
                                                          Laughing
##
                                  1
##
                              Junk
                                                  Canonical_Crying
##
##
               Canonical_Laughing
                                                  Crying_Canonical
##
       Crying_Canonical_Laughing
##
                                                   Crying_Laughing
##
```

```
## Crying_Laughing_Non-Canonical
                                                         Crying_Non-Canonical
##
## Crying_Non-Canonical_Laughing
                                                               Laughing_Crying
##
##
             Laughing_Non-Canonical Laughing_Non-Canonical_Crying
##
                                                      Non-Canonical_Laughing
##
                Non-Canonical Crying
##
prop_cat=data.frame(my_conf_tab*100) #generates precision because columns
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop_cat)[3]<-"pr"</pre>
data.frame(conf_tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","pr")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(pr)), colour = "white") +
  geom_text(aes(label = paste(round(pr), "%")), vjust = -1, size=2) +
  geom_text(aes(label = Freq), vjust = 1,size=1) +
  scale_fill_gradient(low = "white", high = "red", name = "Percentage") +
      theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Precision")+ theme(axis.text.x = element_text(angle = 90, vjust = 0.5, hjust=1))
                     Precision
      Non-Canonical Laughing -
       Non-Canonical_Crying -
 Laughing_Non-Canonical_Crying -
      Laughing_Non-Canonical -
                             0 %
                                   0 %
                                        0 %
                                              0 %
                                                         0 %
                                                                    0 %
                                                                         0 %
                                                                                    0 %
                                                                                                    0 %
                                                                                                               0 %
           Laughing_Crying -
 Crying_Non-Canonical_Laughing -
                                              0 %
                                                                                    0 %
       Crying_Non-Canonical -
 Crying_Laughing_Non-Canonical -
                                   0 %
                                              0 %
                                                                                    0 %
                                                                         0 %
           Crying_Laughing -
     Crying_Canonical_Laughing -
                                              0 %
                                   0 %
                                                                         0 %
                                                                                    0 %
                                                                                                               0 %
                                                                                                     0 %
          Crying_Canonical -
         Canonical_Laughing -
          Canonical_Crying -
                                                                                    5 %
                                                                                         14 %
                                                                                               12 %
                                                                                                    24 %
                                   12 %
                  Junk ·
                                                                                                          11 %
                                        26 %
                                                                         10 %
               Laughing -
                                                              3 %
                                                                         44 %
                                                                                    25 %
                                                                                         14 %
                                                                                               12 %
                                                                                                          33 %
                 Crying -
                                                         33 %
                                                              17 %
                                                                   0 %
                                             25 %
                                                                         30 %
            Non-Canonical -
               Canonical -
                                                   Canonical_Crying-
                                                                                                          -Crying-
                                                              Canonical
                                                                                               -aughing_Crying
                                                                                                     -Canonical
                                                                                                          Laughing_Non-Canonical
                                                                                                                -Canonical
```

Zooniverse

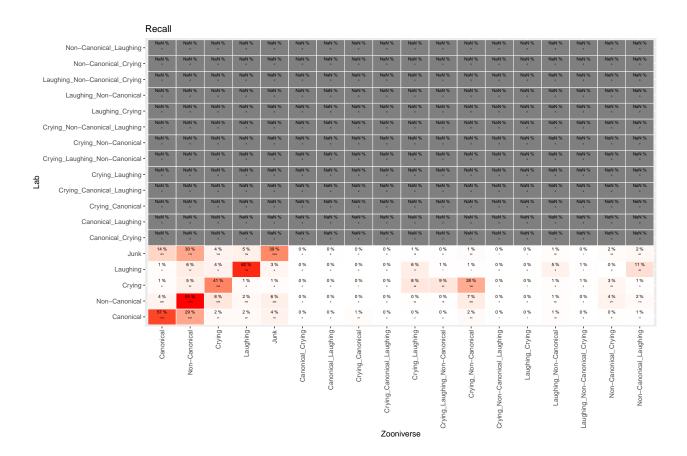
Recall

Recall means: If a segment was called X by lab coders, what proportion of the time was it called X by zooniverse coders?

```
rowsums=rowSums(conf_tab)
my_conf_tab=conf_tab
for(i in 1:18) my_conf_tab[,i]=my_conf_tab[,i]/rowsums[i]
rowSums(my_conf_tab)
```

```
##
                        Canonical
                                                    Non-Canonical
##
                              NaN
                                                              NaN
##
                           Crying
                                                         Laughing
##
                              NaN
                                                              NaN
##
                             Junk
                                                 Canonical_Crying
##
                              NaN
##
              Canonical_Laughing
                                                 Crying_Canonical
##
                              NaN
                                                              NaN
##
       Crying_Canonical_Laughing
                                                  Crying_Laughing
##
##
  Crying_Laughing_Non-Canonical
                                            Crying_Non-Canonical
##
                                                              NaN
##
  Crying_Non-Canonical_Laughing
                                                 Laughing_Crying
##
##
          Laughing_Non-Canonical Laughing_Non-Canonical_Crying
##
                               NaN
##
            Non-Canonical_Crying
                                          Non-Canonical_Laughing
##
```

```
prop_cat=data.frame(conf_tab/rowSums(conf_tab)*100) #generates recall because rows
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop_cat)[3]<-"rec"
data.frame(conf_tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","rec")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
    geom_tile(aes(fill= rescale(rec)), colour = "white") +
    geom_text(aes(label = paste(round(rec),"%")), vjust = -1,size=2) +
    geom_text(aes(label = Freq), vjust = 1,size=1) +
    scale_fill_gradient(low = "white", high = "red", name = "Percentage") +
        theme(legend.position = "none") +
        xlab("Zooniverse") + ylab("Lab") +
        ggtitle("Recall")+ theme(axis.text.x = element_text(angle = 90, vjust = 0.5, hjust=1))
```



repeat collapsing

```
#qiven results above, we map the mixed
data_all$Zoon_classif[data_all$Zoon_classif=="Laughing_Canonical"]<-"Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Laughing_Non-Canonical"]<-"Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Laughing_Non-Canonical_Crying"]<-"Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Laughing_Crying"] <- "Crying"
data_all$Zoon_classif[data_all$Zoon_classif=="Non-Canonical_Crying"]<-"Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Non-Canonical_Laughing_Crying"]<-"Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Crying_Canonical"]<-"Canonical"
# +
data_all$Zoon_classif[data_all$Zoon_classif=="Canonical_Crying"]<-"Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Canonical_Laughing"]<-"Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Laughing_Canonical_Crying"] <- "Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Crying_Laughing"] <- "Crying"
data all$Zoon classif[data all$Zoon classif=="Crying Canonical Laughing"] <- "Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Crying_Laughing_Non-Canonical"] <- "Non-Canonical"
data all$Zoon classif[data all$Zoon classif=="Crying Non-Canonical"]<-"Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Crying_Non-Canonical_Laughing"]<-"Non-Canonical"
data_all$Zoon_classif[data_all$Zoon_classif=="Non-Canonical_Laughing"]<-"Non-Canonical"
#and reset the factors for cleanliness
data_all$Zoon_classif=factor(data_all$Zoon_classif)
data_all$lab=factor(data_all$lab)
sample_data<-cbind(data_all$lab,data_all$Zoon_classif)</pre>
```

```
gac(data = sample_data, kat = 5, weight = c("unweighted"),
    conf.level = 0.95)
## Call:
## gac(data = sample_data, kat = 5, weight = c("unweighted"), conf.level = 0.95)
##
          Estimate
                      StdErr
                                LowerCB UpperCB
## Const 0.5866689 0.0053816 0.5761201 0.5972
##
## Confidence level = 95%
## Sample size = 11571
mycf=confusionMatrix(data all$lab, data all$Zoon classif, dnn = c("Lab", "Zooniverse"))
conf tab=mycf$table
# this package uses sensitivity & specificity
#Sensitivity=recall
#Specificity=precision
mycf
## Confusion Matrix and Statistics
##
##
                  Zooniverse
                   Canonical Non-Canonical Crying Laughing Junk
## Lab
     Canonical
##
                        1039
                                        598
                                                34
                                                          29
                                                               79
                                               573
                                                         154 360
##
     Non-Canonical
                         268
                                       5068
##
     Crying
                           7
                                        279
                                               288
                                                          8
                                                                6
##
     Laughing
                           2
                                         44
                                                19
                                                         115
                                                                6
##
     Junk
                         382
                                        950
                                               122
                                                         136 1005
##
## Overall Statistics
##
##
                  Accuracy : 0.6495
##
                    95% CI: (0.6407, 0.6582)
##
       No Information Rate: 0.5997
       P-Value [Acc > NIR] : < 2.2e-16
##
##
##
                     Kappa: 0.4265
##
##
  Mcnemar's Test P-Value : < 2.2e-16
##
## Statistics by Class:
##
##
                        Class: Canonical Class: Non-Canonical Class: Crying
## Sensitivity
                                  0.61190
                                                        0.7304
                                                                      0.27799
                                  0.92505
## Specificity
                                                         0.7075
                                                                      0.97152
## Pos Pred Value
                                  0.58404
                                                         0.7890
                                                                      0.48980
                                                         0.6366
## Neg Pred Value
                                  0.93270
                                                                      0.93189
## Prevalence
                                  0.14675
                                                         0.5997
                                                                      0.08953
## Detection Rate
                                                                      0.02489
                                  0.08979
                                                        0.4380
## Detection Prevalence
                                                                      0.05082
                                  0.15375
                                                        0.5551
## Balanced Accuracy
                                  0.76847
                                                         0.7189
                                                                      0.62476
##
                        Class: Laughing Class: Junk
## Sensitivity
                                0.260181
                                             0.69025
## Specificity
                                0.993620
                                             0.84281
```

```
## Pos Pred Value
                               0.618280
                                             0.38728
## Neg Pred Value
                               0.971278
                                            0.94975
## Prevalence
                               0.038199
                                             0.12583
## Detection Rate
                               0.009939
                                             0.08686
## Detection Prevalence
                               0.016075
                                             0.22427
## Balanced Accuracy
                               0.626901
                                            0.76653
pdf("../Results/precision_final.pdf",height=10,width=10)
colsums=colSums(conf tab)
my_conf_tab=conf_tab
for(i in 1:5) my_conf_tab[,i]=my_conf_tab[,i]/colsums[i]
colSums(my_conf_tab)
##
       Canonical Non-Canonical
                                      Crying
                                                   Laughing
                                                                     Junk
##
               1
                                           1
                                                                        1
prop_cat=data.frame(my_conf_tab*100) #generates precision because columns
prop cat$id=paste(prop cat$Lab,prop cat$Zooniverse)
colnames(prop cat)[3]<-"pr"</pre>
data.frame(conf_tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","pr")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(pr)), colour = "white") +
  geom_text(aes(label = paste(round(pr), "%")), vjust = -1, size=8) +
  geom_text(aes(label = Freq), vjust = 1,size=8) +
  scale_fill_gradient(low = "white", high = "red", name = "Proportion") +
     theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Precision")+theme(text = element text(size=20),
        axis.text.x = element_text(angle=90, hjust=1))
dev.off()
## pdf
##
     2
pdf("../Results/recall_final.pdf",height=10,width=10)
prop_cat=data.frame(conf_tab/rowSums(conf_tab)*100) #generates recall because rows
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop cat)[3]<-"rec"</pre>
data.frame(conf tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","rec")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(rec)), colour = "white") +
  geom_text(aes(label = paste(round(rec), "%")), vjust = -1, size=8) +
  geom_text(aes(label = Freq), vjust = 1,size=8) +
  scale_fill_gradient(low = "white", high = "red", name = "Proportion") +
     theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Recall")+theme(text = element_text(size=20),
        axis.text.x = element_text(angle=90, hjust=1))
dev.off()
## pdf
##
```

```
data_as_td<-left_join(data_all,demo_data,on="ChildID")</pre>
## Joining, by = c("ChildID", "Age")
## Warning: Column `ChildID` joining factors with different levels, coercing to
## character vector
# CM with just AS kids
data_AS<-subset(data_as_td, Diagnosis=="AngelmanSyndrome")</pre>
mycf=confusionMatrix(data AS$lab, data AS$Zoon classif, dnn = c("Lab", "Zooniverse"))
conf_tab=mycf$table
mycf
## Confusion Matrix and Statistics
##
##
                  Zooniverse
## Lab
                    Canonical Non-Canonical Crying Laughing Junk
##
     Canonical
                                        165
                                                  2
                                                          13
                                                               15
     Non-Canonical
                          100
                                        2984
                                                          92
                                                              115
##
                                                116
                                         39
                                                 15
                                                           2
##
     Crying
                            1
                                                                1
##
     Laughing
                                                  4
                                                                 2
                            0
                                         16
                                                          57
##
     Junk
                          239
                                        618
                                                 34
                                                          92 462
##
## Overall Statistics
##
##
                  Accuracy : 0.6841
##
                    95% CI: (0.6714, 0.6966)
##
       No Information Rate: 0.7247
##
       P-Value [Acc > NIR] : 1
##
##
                      Kappa: 0.3624
##
##
    Mcnemar's Test P-Value : <2e-16
##
## Statistics by Class:
##
                         Class: Canonical Class: Non-Canonical Class: Crying
##
                                  0.20930
                                                         0.7807
                                                                      0.087719
## Sensitivity
## Specificity
                                  0.95974
                                                         0.7087
                                                                      0.991574
## Pos Pred Value
                                  0.31579
                                                         0.8758
                                                                      0.258621
## Neg Pred Value
                                  0.93185
                                                         0.5512
                                                                      0.970092
## Prevalence
                                                         0.7247
                                                                      0.032423
                                  0.08153
## Detection Rate
                                  0.01706
                                                         0.5658
                                                                      0.002844
## Detection Prevalence
                                  0.05404
                                                         0.6460
                                                                      0.010997
## Balanced Accuracy
                                  0.58452
                                                         0.7447
                                                                      0.539646
                         Class: Laughing Class: Junk
## Sensitivity
                                 0.22266
                                               0.7765
## Specificity
                                 0.99562
                                               0.7899
## Pos Pred Value
                                 0.72152
                                               0.3197
## Neg Pred Value
                                 0.96169
                                               0.9653
## Prevalence
                                 0.04854
                                               0.1128
## Detection Rate
                                 0.01081
                                               0.0876
## Detection Prevalence
                                 0.01498
                                               0.2740
## Balanced Accuracy
                                 0.60914
                                               0.7832
```

```
pdf("../Results/precision_AS.pdf",height=10,width=10)
colsums=colSums(conf tab)
my_conf_tab=conf_tab
for(i in 1:5) my_conf_tab[,i]=my_conf_tab[,i]/colsums[i]
colSums(my_conf_tab)
##
       Canonical Non-Canonical
                                                   Laughing
                                                                      Junk
                                       Crying
##
prop_cat=data.frame(my_conf_tab*100) #generates precision because columns
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop cat)[3]<-"pr"</pre>
data.frame(conf tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","pr")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(pr)), colour = "white") +
  geom text(aes(label = paste(round(pr), "%")), vjust = -1, size=8) +
  geom_text(aes(label = Freq), vjust = 1,size=8) +
  scale_fill_gradient(low = "white", high = "red", name = "Proportion") +
     theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Precision")+theme(text = element_text(size=20),
        axis.text.x = element_text(angle=90, hjust=1))
dev.off()
## pdf
##
pdf("../Results/recall_AS.pdf",height=10,width=10)
prop_cat=data.frame(conf_tab/rowSums(conf_tab)*100)
                                                      #generates recall because rows
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop_cat)[3]<-"rec"</pre>
data.frame(conf_tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","rec")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(rec)), colour = "white") +
  geom_text(aes(label = paste(round(rec), "%")), vjust = -1, size=8) +
  geom text(aes(label = Freq), vjust = 1,size=8) +
  scale_fill_gradient(low = "white", high = "red", name = "Proportion") +
     theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Recall")+theme(text = element_text(size=20),
        axis.text.x = element_text(angle=90, hjust=1))
dev.off()
## pdf
##
     2
# CM with just TD kids
data_TD<-subset(data_as_td, Diagnosis=="Low-RiskControl")</pre>
mycf=confusionMatrix(data_TD$lab, data_TD$Zoon_classif, dnn = c("Lab","Zooniverse"))
conf tab=mycf$table
mycf
```

```
## Confusion Matrix and Statistics
##
##
                  Zooniverse
## Lab
                    Canonical Non-Canonical Crying Laughing Junk
##
     Canonical
                          949
                                        433
                                                 32
                                                           16
##
     Non-Canonical
                          168
                                        2084
                                                457
                                                           62
                                                               245
     Crying
                            6
                                        240
                                                273
                                                           6
                                                                 5
##
##
     Laughing
                            2
                                         28
                                                 15
                                                          58
                                                                 4
##
     Junk
                          143
                                         332
                                                 88
                                                           44
                                                              543
##
## Overall Statistics
##
                  Accuracy : 0.6205
##
##
                     95% CI: (0.6083, 0.6325)
##
       No Information Rate: 0.495
##
       P-Value [Acc > NIR] : < 2.2e-16
##
##
                      Kappa: 0.4403
##
##
    Mcnemar's Test P-Value : < 2.2e-16
##
## Statistics by Class:
##
##
                         Class: Canonical Class: Non-Canonical Class: Crying
                                   0.7484
                                                         0.6686
                                                                       0.31561
## Sensitivity
## Specificity
                                   0.8916
                                                          0.7069
                                                                       0.95269
## Pos Pred Value
                                   0.6352
                                                          0.6910
                                                                       0.51509
## Neg Pred Value
                                                                       0.89735
                                   0.9336
                                                          0.6852
## Prevalence
                                   0.2014
                                                          0.4950
                                                                       0.13737
## Detection Rate
                                   0.1507
                                                          0.3310
                                                                       0.04335
## Detection Prevalence
                                   0.2373
                                                          0.4790
                                                                       0.08417
## Balanced Accuracy
                                   0.8200
                                                          0.6878
                                                                       0.63415
##
                         Class: Laughing Class: Junk
## Sensitivity
                                0.311828
                                              0.63066
## Specificity
                                0.991982
                                              0.88834
## Pos Pred Value
                                0.542056
                                              0.47217
## Neg Pred Value
                                0.979321
                                              0.93822
## Prevalence
                                0.029538
                                              0.13673
## Detection Rate
                                0.009211
                                              0.08623
## Detection Prevalence
                                0.016992
                                              0.18263
## Balanced Accuracy
                                0.651905
                                              0.75950
pdf("../Results/precision_TD.pdf",height=10,width=10)
colsums=colSums(conf tab)
my conf tab=conf tab
for(i in 1:5) my_conf_tab[,i]=my_conf_tab[,i]/colsums[i]
colSums(my_conf_tab)
                                                    Laughing
##
       Canonical Non-Canonical
                                        Crying
                                                                       Junk
##
                              1
                                                                          1
               1
                                             1
prop_cat=data.frame(my_conf_tab*100) #generates precision because columns
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop_cat)[3]<-"pr"</pre>
data.frame(conf_tab)->stall
```

```
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","pr")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(pr)), colour = "white") +
  geom_text(aes(label = paste(round(pr), "%")), vjust = -1, size=8) +
  geom_text(aes(label = Freq), vjust = 1,size=8) +
  scale_fill_gradient(low = "white", high = "red", name = "Proportion") +
     theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Precision")+theme(text = element_text(size=20),
        axis.text.x = element_text(angle=90, hjust=1))
dev.off()
## pdf
##
pdf(".../Results/recall_TD.pdf",height=10,width=10)
prop_cat=data.frame(conf_tab/rowSums(conf_tab)*100)
                                                      #generates recall because rows
prop_cat$id=paste(prop_cat$Lab,prop_cat$Zooniverse)
colnames(prop_cat)[3]<-"rec"</pre>
data.frame(conf_tab)->stall
stall$id=paste(stall$Lab,stall$Zooniverse)
stall=merge(stall,prop_cat[c("id","rec")])
ggplot(data = stall, mapping = aes(y = Lab, x=Zooniverse)) +
 geom_tile(aes(fill= rescale(rec)), colour = "white") +
  geom_text(aes(label = paste(round(rec), "%")), vjust = -1, size=8) +
  geom_text(aes(label = Freq), vjust = 1,size=8) +
  scale_fill_gradient(low = "white", high = "red", name = "Proportion") +
     theme(legend.position = "none") +
  xlab("Zooniverse") + ylab("Lab") +
  ggtitle("Recall")+theme(text = element_text(size=20),
        axis.text.x = element_text(angle=90, hjust=1))
dev.off()
## pdf
##
```

Child level descriptors

Although there may be errors at the level of the segment, what we really care about is whether Zooniverse annotations give a reliable image of the child's individual development. This is what we look at in this section. In all of these graphs, red points correspond to children diagnosed with Angelman Syndrome, black for low-risk control

```
#get the ns by child, then calculate the linguistic ratio & canonical ratio, separately for zooniverse
ztab=table(data_all$filename,data_all$Zoon_classif)
z_lr=rowSums(ztab[,c("Canonical","Non-Canonical")])/rowSums(ztab[,-which(colnames(ztab) %in% c("Junk")))
z_cr=ztab[,c("Canonical")]/rowSums(ztab[,c("Canonical","Non-Canonical")])
ltab=table(data_all$filename,data_all$lab)
l_lr=rowSums(ltab[,c("Canonical","Non-Canonical")])/rowSums(ltab[,-which(colnames(ztab) %in% c("Junk")))
l_cr=ltab[,c("Canonical")]/rowSums(ltab[,c("Canonical","Non-Canonical")])
#put all the ratios together
if(sum(rownames(ztab)==rownames(ltab))==dim(ztab)[1]) ratios=cbind(rownames(ztab),z_lr,z_cr,l_lr,l_cr) colnames(ratios)[1]<-"filename"</pre>
```

```
#ages=aggregate(data_all$Age,by=list(data_all$ChildID),mean) #this is a weird way of adding ages, since
#improvement: now we merge with a demo data tab, but note this is merged with child id, so the problem
# Created demo data with filenames. Use filenames instead of childIDs to merge ratios and demo data.
merge(ratios,demo data fn,by="filename")->ratios
colnames(ratios)[dim(ratios)[2]]<-"Age"</pre>
#cbinding results in text, so we numerize the ratios
for(thisvar in c("z_lr","z_cr","l_lr","l_cr")) ratios[,thisvar]=as.numeric(as.character(ratios[,thisvar
summary(ratios)
##
                      filename
                                     z_lr
                                                      z_cr
##
   20180206_110905_009463: 1
                               Min.
                                       :0.5927
                                                 Min.
                                                        :0.02882
   20180419_111712_022875: 1
                                1st Qu.:0.8058
                                                 1st Qu.:0.05891
## 20180530_180405_024879: 1
                                Median :0.8785
                                                 Median: 0.14065
## 20180530 181101 022875: 1
                                Mean
                                      :0.8511
                                                 Mean
                                                       :0.19128
## 20180808_111325_024882: 1
                                3rd Qu.:0.9313
                                                 3rd Qu.:0.28454
##
   20180906_133011_022875: 1
                                Max.
                                       :0.9740
                                                 Max.
                                                        :0.51084
   (Other)
##
                          :14
##
         l lr
                          1 cr
                                         ChildID
                                                                      Diagnosis
##
          :0.3880
                            :0.01488
                                       Length: 20
                                                           AngelmanSyndrome: 10
  Min.
                     \mathtt{Min}.
   1st Qu.:0.9130
                     1st Qu.:0.06609
                                                          Low-RiskControl:10
##
                                       Class : character
                     Median :0.11115
## Median :0.9578
                                       Mode :character
  Mean
          :0.9131
                     Mean
                           :0.19129
##
   3rd Qu.:0.9787
                     3rd Qu.:0.26529
## Max.
           :0.9968
                     Max.
                           :0.60000
##
##
  Sex
                Age
##
  F: 7
          Min. : 4.67
##
  M:13
           1st Qu.:12.13
##
           Median :17.50
                  :25.04
##
           Mean
##
           3rd Qu.:43.46
##
           Max.
                  :53.26
```

Correlations with age

We first look generally at two measures that have been found to relate to age:

- linguistic ratio = ("Canonical"+"Non-Canonical")/"All vocalizations" (i.e. we remove junk)
- canonical ratio = "Canonical"/("Canonical"+"Non-Canonical") (i.e. we remove junk + non-linguistic vocalizations)

TODO

##

- make margins smaller
- remove title repetition (age only at the bottom)

```
mypch=c(4,20)
names(mypch) <-c("Low-RiskControl", "AngelmanSyndrome")</pre>
jpeg("../Results/corage.jpg",width=20,height=20,units="cm",res=300)
layout(matrix(c(1:4), 2, 2, byrow = F))
for(thisvar in c("z_lr","z_cr","l_lr","l_cr")) {
  plot(ratios[,thisvar]~ratios$Age, pch=mypch[ratios$Diagnosis],xlab="Age (months)",ylab=prettynames[th
       col=mycols[ratios$Diagnosis])
  abline(lm(ratios[,thisvar]~ratios$Age,subset=c(ratios$Diagnosis=="AngelmanSyndrome")),col="black")
  myr=paste0("r=",round(cor.test(ratios[ratios$Diagnosis=="AngelmanSyndrome",thisvar],ratios$Age[ratios
  text(mean(ratios$Age[ratios$Diagnosis=="AngelmanSyndrome"]), mean(ratios[ratios$Diagnosis=="AngelmanSyndrome"])
    abline(lm(ratios[,thisvar]~ratios$Age,subset=c(ratios$Diagnosis!="AngelmanSyndrome")),col="red")
   myr=paste0("r=",round(cor.test(ratios[ratios$Diagnosis!="AngelmanSyndrome",thisvar],ratios$Age[rati
    text(mean(ratios$Age[ratios$Diagnosis!="AngelmanSyndrome"]), mean(ratios[ratios$Diagnosis!="Angelman
}
dev.off()
## pdf
##
```

Correlations across zooniverse and lab

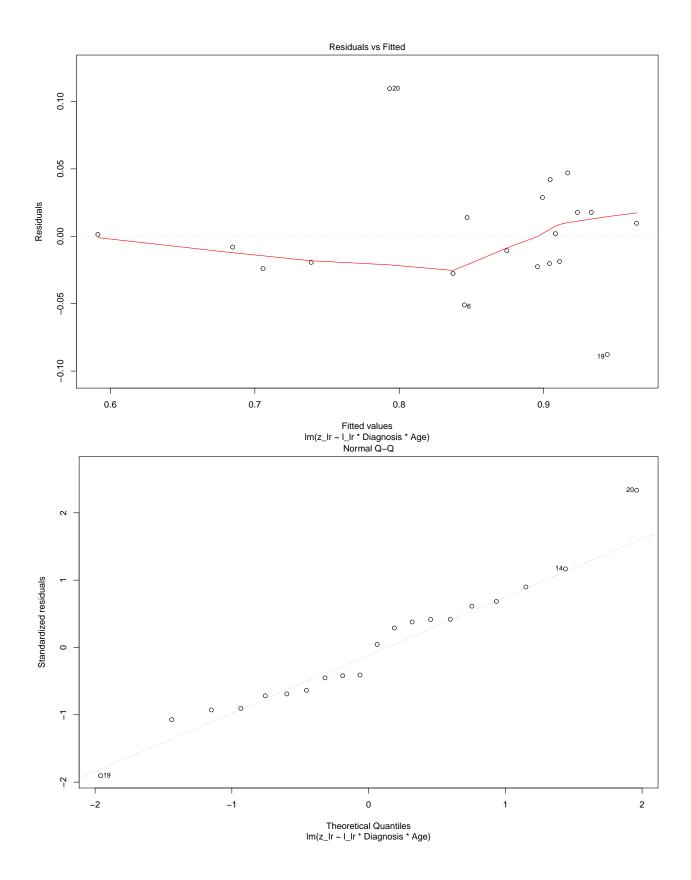
But the key thing for us: Are Zooniverse annotations describing children similar to lab annotations? The answer is clearly ves.

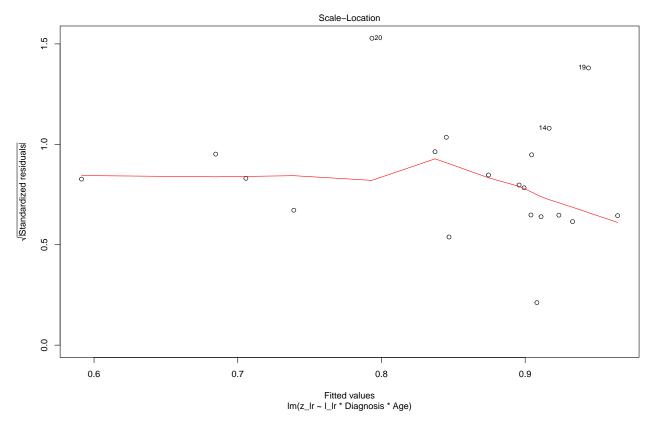
TODO:

- add code to print out the results paragraphs
- change figure generation to have lines fitted to each group

```
#Ling ratio
pdf("../Results/ling_rat_z_vs_l_final.pdf",height=5,width=5)
lims=range(c(ratios[,"z_lr"],ratios[,"l_lr"]))
  myr=round(cor.test(ratios[,"z_lr"],ratios[,"l_lr"])$estimate,3)
  plot(ratios[,"z_lr"]~ratios[,"l_lr"], pch=20,xlab=prettynames["l_lr"],ylab=prettynames["z_lr"],main=p
       xlim=lims,ylim=lims,
       col=mycols[ratios$Diagnosis])
  abline(lm(ratios[,"z_lr"]~ratios[,"l_lr"]))
  lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
## pdf
##
pdf("../Results/can_rat_z_vs_l_final.pdf",height=5,width=5)
lims=range(c(ratios[,"z_cr"],ratios[,"l_cr"]))
    myr=round(cor.test(ratios[,"z_cr"],ratios[,"l_cr"])$estimate,3)
  plot(ratios[,"z_cr"]~ratios[,"l_cr"], pch=20,xlab=prettynames["l_cr"],ylab=prettynames["z_cr"],main=p
       xlim=lims,ylim=lims,
       col=mycols[ratios$Diagnosis])
  abline(lm(ratios[,"z_cr"]~ratios[,"l_cr"]),col="darkgray")
    lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
```

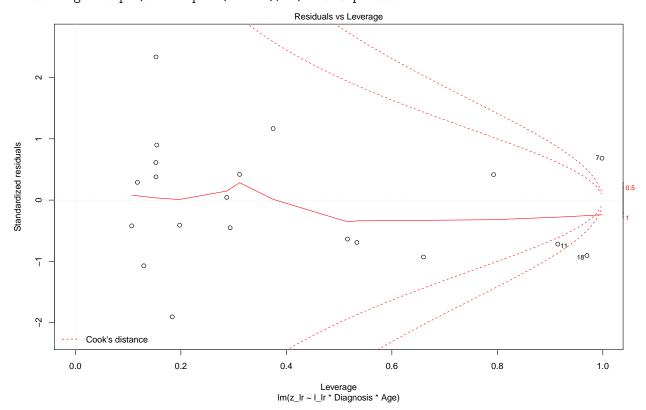
```
## pdf
##
    2
lin_mod=lm(z_lr~l_lr*Diagnosis*Age,data=ratios)
summary(lin_mod)
##
## Call:
## lm(formula = z_lr ~ l_lr * Diagnosis * Age, data = ratios)
## Residuals:
##
        Min
                   1Q
                         Median
                                      3Q
## -0.087697 -0.020805 -0.003327 0.017732 0.109518
##
## Coefficients:
##
                                    Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                    -1.89796
                                               2.53800 -0.748 0.4690
## l_lr
                                    2.95125
                                               2.65350 1.112
                                                                 0.2878
## DiagnosisLow-RiskControl
                                    2.84516
                                               2.54890
                                                        1.116
                                                                0.2862
                                               0.05740
                                                        0.624 0.5442
## Age
                                    0.03583
## l_lr:DiagnosisLow-RiskControl
                                               2.66494 -1.138
                                    -3.03307
                                                                 0.2773
## l_lr:Age
                                               0.05996 -0.637
                                    -0.03819
                                                                 0.5362
## DiagnosisLow-RiskControl:Age
                                   -0.15256
                                               0.07332 -2.081
                                                                 0.0595 .
## l_lr:DiagnosisLow-RiskControl:Age 0.16017
                                               0.07535 2.126
                                                                 0.0550 .
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.05096 on 12 degrees of freedom
## Multiple R-squared: 0.8575, Adjusted R-squared: 0.7744
## F-statistic: 10.32 on 7 and 12 DF, p-value: 0.0003014
plot(lin_mod)
```





Warning in sqrt(crit * p * (1 - hh)/hh): NaNs produced

Warning in sqrt(crit * p * (1 - hh)/hh): NaNs produced



Code junkyard

This is redundant code

```
Different pdfs for diff groups
```

```
prettynames=c("AS Linguistic Ratio (Zooniverse)", "AS Canonical Ratio (Zooniverse)",
             "AS Linguistic Ratio (Lab)", "AS Canonical Ratio (Lab)")
names(prettynames)<-c("z_lr","z_cr","l_lr","l_cr")</pre>
AS_ratios<-subset(ratios, Diagnosis=="AngelmanSyndrome")
TD_ratios<-subset(ratios, Diagnosis=="Low-RiskControl")</pre>
for(thisvar in c("z_lr","z_cr","l_lr","l_cr")) {
  myr=round(cor.test(AS_ratios[,thisvar],AS_ratios$Age)$estimate,3)
  plot(AS_ratios[,thisvar]~AS_ratios$Age, pch=20,xlab="Age (months)",ylab=prettynames[thisvar],main=pas
  abline(lm(AS_ratios[,thisvar]~AS_ratios$Age))
prettynames=c("TD Linguistic Ratio (Zooniverse)", "TD Canonical Ratio (Zooniverse)",
             "TD Linguistic Ratio (Lab)", "TD Canonical Ratio (Lab)")
for(thisvar in c("z_lr","z_cr","l_lr","l_cr")) {
  myr=round(cor.test(TD_ratios[,thisvar],TD_ratios$Age)$estimate,3)
  plot(TD_ratios[,thisvar]~TD_ratios$Age, pch=20,xlab="Age (months)",ylab=prettynames[thisvar],main=pas
  abline(lm(TD ratios[,thisvar]~TD ratios$Age))
 }
#Ling ratio
pdf("../Results/td_ling_rat_z_vs_l_final.pdf",height=5,width=5)
lims=range(c(TD_ratios[,"z_lr"],TD_ratios[,"l_lr"]))
  myr=round(cor.test(TD_ratios[,"z_lr"],TD_ratios[,"l_lr"])$estimate,3)
  plot(TD_ratios[,"z_lr"]~TD_ratios[,"l_lr"], pch=20,xlab=prettynames["l_lr"],ylab=prettynames["z_lr"],
       xlim=lims,ylim=lims,
       col=mycols[TD_ratios$Diagnosis])
  abline(lm(TD_ratios[,"z_lr"]~TD_ratios[,"l_lr"]))
  lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
  #CR
pdf("../Results/td_can_rat_z_vs_l_final.pdf",height=5,width=5)
lims=range(c(TD_ratios[,"z_cr"],TD_ratios[,"l_cr"]))
    myr=round(cor.test(TD_ratios[,"z_cr"],TD_ratios[,"l_cr"])$estimate,3)
  plot(TD_ratios[,"z_cr"]~TD_ratios[,"l_cr"], pch=20,xlab=prettynames["l_cr"],ylab=prettynames["z_cr"],
       xlim=lims,ylim=lims,
       col=mycols[TD_ratios$Diagnosis])
  abline(lm(TD_ratios[,"z_cr"]~TD_ratios[,"l_cr"]),col="darkgray")
    lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
#Ling ratio
pdf("../Results/AS_ling_rat_z_vs_l_final.pdf",height=5,width=5)
lims=range(c(AS_ratios[,"z_lr"],AS_ratios[,"l_lr"]))
  myr=round(cor.test(AS_ratios[,"z_lr"],AS_ratios[,"l_lr"])$estimate,3)
  plot(AS ratios[,"z lr"]~AS ratios[,"l lr"], pch=20,xlab=prettynames["l lr"],ylab=prettynames["z lr"],
       xlim=lims,ylim=lims,
       col=mycols[AS_ratios$Diagnosis])
  abline(lm(AS_ratios[,"z_lr"]~AS_ratios[,"l_lr"]))
```

```
lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
  #CR
pdf("../Results/AS_can_rat_z_vs_l_final.pdf",height=5,width=5)
lims=range(c(AS_ratios[,"z_cr"],AS_ratios[,"l_cr"]))
    myr=round(cor.test(AS_ratios[,"z_cr"],AS_ratios[,"l_cr"])$estimate,3)
  plot(AS_ratios[,"z_cr"]~AS_ratios[,"l_cr"], pch=20,xlab=prettynames["l_cr"],ylab=prettynames["z_cr"],
       xlim=lims,ylim=lims,
       col=mycols[AS_ratios$Diagnosis])
  abline(lm(AS_ratios[,"z_cr"]~AS_ratios[,"l_cr"]),col="darkgray")
   lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
combined pdf
#COMBINED to save space
pdf("../Results/combined_final.pdf",height=5,width=5)
lims=range(c(ratios[,"z_lr"],ratios[,"l_lr"]),c(ratios[,"z_cr"],ratios[,"l_cr"]))
  #myr=round(cor.test(ratios[,"z_lr"],ratios[,"l_lr"])$estimate,3)
  plot(ratios[,"z_lr"]~ratios[,"l_lr"],xlab="Laboratory annotations",ylab="Zooniverse annotations",
       xlim=lims,ylim=lims,
       pch=20,col=mycols[ratios$Diagnosis])
   points(ratios[,"z_cr"]~ratios[,"l_cr"], pch=2, col=mycols[ratios$Diagnosis])
  abline(lm(ratios[,"z_cr"]~ratios[,"l_cr"]))
  abline(lm(ratios[,"z lr"]~ratios[,"l lr"]),lty=3)
 # lines(c(0,1),c(0,1),lty=2,col="darkgray")
dev.off()
```