Gold standard inspection

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Inspection of the existing data from Hollink et al.

Loading libraries

```
library(readr)
library(tidyverse)
library(dplyr)
library(readxl)
library(ggplot2)
library("Rgraphviz")
```

Datasets from Hollink et al.

Cleaning up dataframe layout

• reduce hierarchy lvl columns to 2 dim

```
#Function to create new columns for synsets
red_lvls <- function(ds, synlen = 6, dflen){</pre>
  ds_copy <- ds
  synsets <- c()
  tree_depth <- c()</pre>
  tree <- c("","","","","","","")
  ancestors <- c()
  for (i in 1:length(ds$lvl1_synset)){
    if(!is.na(ds[["lvl1_synset"]][i])){
      syn <- toString(ds[["lvl1_synset"]][i])</pre>
      synsets <- append(synsets, syn)</pre>
      tree_depth <- append(tree_depth, 1)</pre>
      tree[1] <- syn
      ancestors <- append(ancestors, "root")</pre>
    else if(!is.na(ds[["lvl2_synset"]][i])){
      syn <- toString(ds[["lvl2_synset"]][i])</pre>
      synsets <- append(synsets, syn)</pre>
      tree_depth <- append(tree_depth, 2)</pre>
      tree[2] <- syn
      ancestors <- append(ancestors, tree[1])</pre>
    }
    else if(!is.na(ds[["lvl3_synset"]][i])){
      syn <- toString(ds[["lvl3 synset"]][i])</pre>
      synsets <- append(synsets, syn)</pre>
      tree_depth <- append(tree_depth, 3)</pre>
      tree[3] <- syn
      ancestors <- append(ancestors, tree[2])</pre>
```

```
else if(!is.na(ds[["lvl4_synset"]][i])){
    syn <- toString(ds[["lvl4_synset"]][i])</pre>
    synsets <- append(synsets, syn)</pre>
    tree_depth <- append(tree_depth, 4)</pre>
    tree[4] <- syn
    ancestors <- append(ancestors, tree[3])</pre>
  }
  else if(!is.na(ds[["lvl5_synset"]][i])){
    syn <- toString(ds[["lvl5_synset"]][i])</pre>
    synsets <- append(synsets, syn)</pre>
    tree_depth <- append(tree_depth, 5)</pre>
    tree[5] <- syn
    ancestors <- append(ancestors, tree[4])</pre>
  }
  else if(!is.na(ds[["lv16_synset"]][i])){
    syn <- toString(ds[["lv16_synset"]][i])</pre>
    synsets <- append(synsets, syn)</pre>
    tree_depth <- append(tree_depth, 6)</pre>
    tree[6] <- syn
    ancestors <- append(ancestors, tree[5])</pre>
  }
  else if(!is.na(ds[["lv17_synset"]][i]) & synlen > 6){
    syn <- toString(ds[["lvl7_synset"]][i])</pre>
    synsets <- append(synsets, syn)</pre>
    tree_depth <- append(tree_depth, 7)</pre>
    tree[7] <- syn
    ancestors <- append(ancestors, tree[6])</pre>
  else if(!is.na(ds[["lvl8_synset"]][i]) & synlen > 7){
    syn <- toString(ds[["lvl8_synset"]][i])</pre>
    synsets <- append(synsets, syn)</pre>
    tree_depth <- append(tree_depth, 8)</pre>
    tree[8] <- syn
    ancestors <- append(ancestors, tree[7])</pre>
  }
  #needs optional lvl 7 and 8, see optional parameters
    print("Some error must have occured.")
    print(ds[['synonyms']][i])
ds_copy$synsets <- synsets
ds_copy$tree_depth <- tree_depth</pre>
ds_copy$ancestors <- ancestors</pre>
ds_copy
```

```
#adding all the new columns
annotator1_fruits <- red_lvls(annotator1_fruits)</pre>
annotator1_tools <- red_lvls(annotator1_tools)</pre>
annotator1_instruments <- red_lvls(annotator1_instruments, 8)</pre>
annotator2_tools <- red_lvls(annotator2_tools)</pre>
annotator3_tools <- red_lvls(annotator3_tools)</pre>
#Now we remove the unnecessary old columns from the dfs
bl_tools <- data.frame(matrix(ncol = 6, nrow = 164))</pre>
colnames(bl_tools) <- c('synsets', 'tree_depth', 'ancestors',</pre>
                          'judgmt_a1', 'judgmt_a2', 'judgmt_a3')
bl_tools$synsets <- annotator1_tools$synsets</pre>
bl_tools$tree_depth <- annotator1_tools$tree_depth</pre>
bl_tools$ancestors <- annotator1_tools$ancestors</pre>
bl_tools$judgmt_a1 <- annotator1_tools$isBasic</pre>
#add judgements of other 2 annotators
bl_tools$judgmt_a2 <- annotator2_tools$isBasic</pre>
bl_tools$judgmt_a3 <- annotator3_tools$isBasic</pre>
#instruments
bl_instruments <- data.frame(matrix(ncol = 4, nrow = 192))
colnames(bl_instruments) <- c('synsets', 'tree_depth', 'ancestors',</pre>
                                 'judgmt_a1')
bl_instruments$synsets <- annotator1_instruments$synsets</pre>
bl_instruments$tree_depth <- annotator1_instruments$tree_depth</pre>
bl_instruments$ancestors <- annotator1_instruments$ancestors</pre>
bl_instruments$judgmt_a1 <- annotator1_instruments$isBasic</pre>
#fruits
bl fruits <- data.frame(matrix(ncol = 4, nrow = 197))
colnames(bl_fruits) <- c('synsets', 'tree_depth', 'ancestors',</pre>
                           'judgmt a1')
bl_fruits$synsets <- annotator1_fruits$synsets</pre>
bl_fruits$tree_depth <- annotator1_fruits$tree_depth</pre>
bl_fruits$ancestors <- annotator1_fruits$ancestors</pre>
bl_fruits$judgmt_a1 <- annotator1_fruits$isBasic</pre>
```

Inspecting new dataframes

```
head(bl_tools)
```

synsets tree_depth

ancestors

```
## 1 [Synset('hand_tool.n.01'),
                                           1
                                                                     root
## 2
           [Synset('awl.n.01'),
                                           2 [Synset('hand_tool.n.01'),
## 3
      [Synset('bradawl.n.01')],
                                           3
                                                    [Synset('awl.n.01'),
     [Synset('scriber.n.01')]],
                                           3
                                                    [Synset('awl.n.01'),
## 4
## 5
        [Synset('bevel.n.02')],
                                           2 [Synset('hand_tool.n.01'),
## 6
       [Synset('bodkin.n.03')],
                                           2 [Synset('hand_tool.n.01'),
     judgmt_a1 judgmt_a2 judgmt_a3
##
## 1
             h
                        h
## 2
             b
                        b
                                   b
## 3
             1
                        1
                                   1
             1
                        1
                                   1
## 5
             b
                        b
                                   b
                                   1
## 6
             1
                        b
head(bl_fruits)
##
                                   synsets tree_depth
## 1
             [Synset('edible_fruit.n.01')
## 2
                   [Synset('ackee.n.01')]
                                                     2
## 3
            [Synset('anchovy pear.n.02')]
                                                     2
## 4
                    [Synset('apple.n.01')
                                                     2
## 5
            [Synset('cooking_apple.n.01')
                                                     3
## 6 [Synset('bramley's_seedling.n.01')]
##
                          ancestors judgmt a1
## 1
                               root
                                             h
## 2
      [Synset('edible_fruit.n.01')
                                             b
## 3
      [Synset('edible_fruit.n.01')
                                             b
## 4
      [Synset('edible_fruit.n.01')
                                             b
## 5
              [Synset('apple.n.01')
                                             1
## 6 [Synset('cooking_apple.n.01')
head(bl_instruments)
```

```
##
                                  synsets tree_depth
## 1 [Synset('musical_instrument.n.01')
                                                    1
## 2
          [Synset('barrel_organ.n.01')]
                                                    2
## 3
                    [Synset('bass.n.07')
                                                    2
## 4
            [Synset('bass_fiddle.n.01')]
                                                    3
## 5
            [Synset('bass_guitar.n.01')]
                                                    3
## 6
               [Synset('bass_horn.n.01')
                                                    3
##
                               ancestors judgmt_a1
## 1
                                     root
                                                  h
## 2 [Synset('musical_instrument.n.01')
                                                   b
## 3 [Synset('musical_instrument.n.01')
                                                  h
## 4
                    [Synset('bass.n.07')
                                                   1
## 5
                    [Synset('bass.n.07')
                                                   1
## 6
                    [Synset('bass.n.07')
```

Quick visualization of Tools

Count of tools by depth

Colored by annotator judgement.

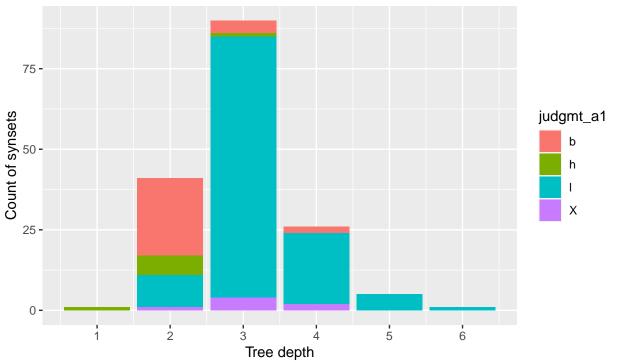


Figure 1.: Tools by depth, colored by judgement.

Datasets from Niamh Henry

```
all_ediblefruit <- read_csv("./niamh/labels/all_ediblefruit_labelled.csv")
all_handtool <- read_csv("./niamh/labels/all_handtool_labelled.csv")
all_instrument <- read_csv("./niamh/labels/all_musicalinstruments_labelled.csv")
all_furniture <- read_csv("./niamh/labels/GoldStandard_Furniture_merged.csv")
all_garments <- read_xlsx("./niamh/labels/GoldStandard_Garments_merged.xlsx")
```

Now I can complete the two dataframes bl_fruits and _instruments with the missing annotations. * Check if same order * copy over annotations columns (2) * copy over glossary and synonyms (3)

```
issameorder1 <- (all_ediblefruit$A1_Label == bl_fruits$judgmt_a1) #True
bl_fruits$judgmt_a2 <- all_ediblefruit$Label
bl_fruits$judgmt_a3 <- all_ediblefruit$A3_Label</pre>
```

```
bl_fruits$synonyms <- all_ediblefruit$Synonyms
bl_fruits$glossary <- all_ediblefruit$Glossary

issameorder2 <- all_instrument$Label == bl_instrument$judgmt_a1 #True

bl_instruments$judgmt_a2 <- all_instrument$A2_Label
bl_instruments$judgmt_a3 <- all_instrument$A3_Label
bl_instruments$synonyms <- all_instrument$Synonyms
bl_instruments$glossary <- all_instrument$Glossary

bl_tools$synonyms <- all_handtool$Synonyms
bl_tools$glossary <- all_handtool$Glossary</pre>
```

Having both the data from Niamh and Hollink, I finally have all of the information. Niamh added the synonyms and glossary to her dataframe and she has the 2 missing anotations from the two other annotators.

By visualizing the trees (below) I found that some rows in the dataset are duplicates. There are also cases where the synset column has duplicates, but some other information in the same column is different, e.g. ancestor. Removing pure duplicates is easy, but removing semi-duplicates with differing annotations is going to be tougher. I will probably have to make a list of all semi-duplicates and handpick the candidate to keep.

Eliminating duplicates

Function definitions

```
find_total_dups <- function(df){</pre>
  dupes <- data.frame()</pre>
  dups_bools <- duplicated(df)</pre>
  dups_pos <- which(dups_bools)</pre>
  for (x in dups_pos){
    dupes <- rbind(dupes, df[which(df$synonyms == df$synonyms[x]),])</pre>
  }
  dupes
}
find_semi_dupes <- function(df){</pre>
  dupes <- data.frame()</pre>
  dup_bools1 <- duplicated(df$synsets)</pre>
  dup_bools2 <- duplicated(df$synonyms)</pre>
  dup_bools <- dup_bools1 | dup_bools2</pre>
  dup_pos <- which(dup_bools)</pre>
  dup <- c()
  for (x in dup_pos){
    dup <- unique(append(dup, which(df$synonyms == df$synonyms[x])))</pre>
  }
  df [dup,]
}
```

```
#fruits
fruits_has_total_dup <- find_total_dups(bl_fruits) #NULL
fruits_has_semi_dup <- find_semi_dupes(bl_fruits) #2

#tools
tools_has_total_dup <- find_total_dups(bl_tools) #NULL
tools_has_semi_dup <- find_semi_dupes(bl_tools) #14

#instruments
instruments_has_total_dup <- find_total_dups(bl_instruments) #yes, 3
instruments_has_semi_dup <- find_semi_dupes(bl_instruments) # many</pre>
```

Now that I can detect complete or semi duplicates, I will handpick the rows to be eliminated from the original data.

Fruits

```
print.data.frame(fruits_has_total_dup)
```

data frame with 0 columns and 0 rows

The fruits dataset has 0 total duplicates.

```
print.data.frame(fruits_has_semi_dup[,c("synsets", "ancestors","judgmt_a1","judgmt_a2","judgmt_a3")])
```

```
##
                         synsets
                                                     ancestors judgmt a1
        [Synset('currant.n.01')
                                        [Synset('berry.n.01')
## 42
## 105 [Synset('currant.n.03')]
                                       [Synset('raisin.n.01')
                                                                       1
       [Synset('medlar.n.03')] [Synset('edible_fruit.n.01')
## 148
                                                                       b
       [Synset('medlar.n.04')] [Synset('edible_fruit.n.01')
## 149
##
       judgmt_a2 judgmt_a3
## 42
               1
                         b
## 105
               1
                         1
## 148
               b
                         1
                         X
## 149
               b
```

There are 2 instances of semi-duplicate concepts. #### The currant Currant has also been listed as a subordinate of raisin, additionally to berry. This seems superflous as the fruit is still the same fruit after drying. People only tend to call all kinds of dried berries 'raisin'. I will remove the raisin subordinate (105).

The medlar There does not seem to be any difference between both instances, except for the second one having a higher digit at the end of the name and the third annotator giving two different judgements. I will remove the one with the X judgement (149).

Removal

```
fruits_rm <- c(105, 149)
bl_fruits_new <- bl_fruits[-fruits_rm,]</pre>
```

Tools

```
print.data.frame(tools_has_total_dup)
```

data frame with 0 columns and 0 rows

Tools has no total duplicates.

```
print.data.frame(tools_has_semi_dup[,c("synsets", "ancestors","judgmt_a1","judgmt_a2","judgmt_a3")])
```

```
##
                                   synsets
                                                                ancestors
## 33
              [Synset('hand_shovel.n.01'),
                                              [Synset('hand_tool.n.01'),
## 109
              [Synset('hand_shovel.n.01'),
                                                 [Synset('shovel.n.01'),
## 34
             [Synset('coal_shovel.n.01')], [Synset('hand_shovel.n.01'),
## 110
             [Synset('coal_shovel.n.01')], [Synset('hand_shovel.n.01'),
## 35
       [Synset('entrenching_tool.n.01')], [Synset('hand_shovel.n.01'),
## 111 [Synset('entrenching_tool.n.01')], [Synset('hand_shovel.n.01'),
## 36
                    [Synset('spade.n.02'), [Synset('hand_shovel.n.01'),
                    [Synset('spade.n.02'), [Synset('hand_shovel.n.01'),
## 112
## 37
             [Synset('ditch_spade.n.01')],
                                                   [Synset('spade.n.02'),
             [Synset('ditch_spade.n.01')],
                                                   [Synset('spade.n.02'),
## 113
## 38
          [Synset('garden_spade.n.01')]],
                                                   [Synset('spade.n.02'),
          [Synset('garden_spade.n.01')]],
## 114
                                                   [Synset('spade.n.02'),
## 39
                   [Synset('spud.n.02')]], [Synset('hand_shovel.n.01'),
                   [Synset('spud.n.02')]], [Synset('hand_shovel.n.01'),
## 115
##
       judgmt_a1 judgmt_a2 judgmt_a3
## 33
               Х
                          Х
                                    1
## 109
               1
                          1
                                    1
               X
                          X
                                    1
## 34
               1
                          1
                                    1
## 110
## 35
               X
                          X
                                    1
## 111
               1
                          1
                                    1
## 36
               X
                          X
                                     1
               1
                                    1
## 112
                          b
               Х
                          X
## 37
                                    1
               1
                          1
                                    1
## 113
               Х
                          Х
                                    1
## 38
## 114
               1
                          1
                                    1
## 39
               Х
                          Х
                                    1
               1
                                    1
## 115
                          ٦
```

Hand Shovel RM 33

Coal Shovel RM 34

```
Entrenching Tool RM 35
```

Spade RM 36

Ditch Spade RM 37

Garden Spade RM 38

Spud RM 39

Removal

```
tools_rm <- c(33:39)
bl_tools_new <- bl_fruits[-tools_rm,]</pre>
```

Instruments

```
print.data.frame(instruments_has_total_dup[,c("synsets", "ancestors","judgmt_a1","judgmt_a2","judgmt_a3
```

```
##
                                synsets
                                                           ancestors judgmt_a1
## 27
           [Synset('baby_grand.n.01')] [Synset('grand_piano.n.01')
## 59
           [Synset('baby_grand.n.01')] [Synset('grand_piano.n.01')
                                                                              X
           [Synset('baby_grand.n.01')] [Synset('grand_piano.n.01')
                                                                              Х
## 107
       [Synset('concert_grand.n.01')]] [Synset('grand_piano.n.01')
                                                                              1
## 28
## 60
       [Synset('concert_grand.n.01')]] [Synset('grand_piano.n.01')
                                                                              Х
## 108 [Synset('concert_grand.n.01')]] [Synset('grand_piano.n.01')
                                                                              Х
## 22
               [Synset('spinet.n.02')] [Synset('harpsichord.n.01')
                                                                              1
                                             [Synset('upright.n.02')
## 31
             [Synset('spinet.n.01')]]]
                                                                              1
## 63
             [Synset('spinet.n.01')]]]
                                             [Synset('upright.n.02')
                                                                              X
## 94
                [Synset('spinet.n.02')] [Synset('harpsichord.n.01')
                                                                              Х
                                             [Synset('upright.n.02')
## 111
             [Synset('spinet.n.01')]]]
                                                                              X
##
       judgmt_a2 judgmt_a3
## 27
               1
                          1
## 59
               1
                          X
## 107
               1
                          X
## 28
               1
                          1
## 60
               1
                          X
## 108
               1
                          X
               1
                          ٦
## 22
## 31
               1
                         1
## 63
               1
                          X
                         Х
## 94
               1
               1
## 111
                         X
```

Baby Grand RM 59, 107

Concert Grand RM 60, 108

Spinet RM 63, 94, 111

```
print.data.frame(instruments_has_semi_dup[,c("synsets", "ancestors","judgmt_a1","judgmt_a2","judgmt_a3"
```

```
##
                                   synsets
## 22
                  [Synset('spinet.n.02')]
##
   31
                [Synset('spinet.n.01')]]]
                [Synset('spinet.n.01')]]]
## 63
## 94
                  [Synset('spinet.n.02')]
##
  111
                [Synset('spinet.n.01')]]]
             [Synset('synthesizer.n.02')]
##
  13
##
   32
            [Synset('synthesizer.n.02')]]
   25
                    [Synset('piano.n.01')
##
                    [Synset('piano.n.01')
##
  57
  105
                    [Synset('piano.n.01')
##
  26
              [Synset('grand_piano.n.01')
##
## 58
              [Synset('grand_piano.n.01')
##
  106
              [Synset('grand_piano.n.01')
## 27
              [Synset('baby_grand.n.01')]
##
  59
              [Synset('baby_grand.n.01')]
              [Synset('baby_grand.n.01')]
##
  107
##
   28
         [Synset('concert_grand.n.01')]]
         [Synset('concert_grand.n.01')]]
##
  60
##
   108
         [Synset('concert_grand.n.01')]]
       [Synset('mechanical_piano.n.01')]
##
   29
       [Synset('mechanical_piano.n.01')]
##
   61
       [Synset('mechanical_piano.n.01')]
                  [Synset('upright.n.02')
##
  30
##
   62
                  [Synset('upright.n.02')
## 110
                  [Synset('upright.n.02')
## 4
             [Synset('bass_fiddle.n.01')]
             [Synset('bass_fiddle.n.01')]
## 71
## 19
              [Synset('clavichord.n.01')]
## 91
              [Synset('clavichord.n.01')]
  20
                  [Synset('clavier.n.02')
## 92
                  [Synset('clavier.n.02')
##
  21
              [Synset('harpsichord.n.01')
## 93
              [Synset('harpsichord.n.01')
## 23
              [Synset('virginal.n.01')]]]
## 95
              [Synset('virginal.n.01')]]]
##
  5
             [Synset('bass_guitar.n.01')]
## 99
             [Synset('bass_guitar.n.01')]
## 96
                [Synset('dulcimer.n.01')]
## 116
              [Synset('dulcimer.n.02')]]]
                [Synset('bass_horn.n.01')
## 6
## 120
                [Synset('bass_horn.n.01')
## 7
               [Synset('euphonium.n.01')]
## 121
               [Synset('euphonium.n.01')]
## 8
                [Synset('helicon.n.01')]]
## 122
                [Synset('helicon.n.01')]]
               [Synset('accordion.n.01')]
## 17
```

```
## 133
               [Synset('accordion.n.01')]
##
  24
                   [Synset('organ.n.05')]
## 141
                    [Synset('organ.n.05')]
## 9
              [Synset('bombardon.n.02')]]
            [Synset('bombardon.n.02')]]]]
##
   180
                                          ancestors judgmt_a1 judgmt_a2
##
## 22
                       [Synset('harpsichord.n.01')
                                                              ٦
                                                                         1
## 31
                           [Synset('upright.n.02')
                                                              1
                                                                         1
##
   63
                           [Synset('upright.n.02')
                                                              X
                                                                         1
                                                              Х
                                                                         1
##
  94
                       [Synset('harpsichord.n.01')
##
   111
                           [Synset('upright.n.02')
                                                              X
                                                                         1
   13
                                                              b
##
            [Synset('electronic_instrument.n.01')
                                                                         b
##
   32
              [Synset('keyboard_instrument.n.01')
                                                              X
                                                                         b
  25
##
              [Synset('keyboard_instrument.n.01')
                                                              b
                                                                         b
## 57
                                                              X
            [Synset('percussion_instrument.n.01')
                                                                         h
##
   105
              [Synset('stringed_instrument.n.01')
                                                              Х
                                                                         b
   26
                                                              1
                                                                         1
##
                             [Synset('piano.n.01')
##
   58
                             [Synset('piano.n.01')
                                                              X
                                                                         b
   106
                                                              X
                                                                         1
##
                             [Synset('piano.n.01')
##
   27
                       [Synset('grand_piano.n.01')
                                                              1
                                                                         1
##
  59
                       [Synset('grand_piano.n.01')
                                                              X
                                                                         1
  107
                       [Synset('grand_piano.n.01')
                                                              X
                                                                         1
##
## 28
                                                              1
                       [Synset('grand_piano.n.01')
                                                                         1
                                                              X
                                                                         1
##
   60
                       [Synset('grand_piano.n.01')
                                                              X
## 108
                       [Synset('grand_piano.n.01')
                                                                         1
##
  29
                             [Synset('piano.n.01')
                                                              1
                                                                         1
  61
                                                              Х
                                                                         b
##
                             [Synset('piano.n.01')
                                                              X
                                                                         1
##
   109
                             [Synset('piano.n.01')
  30
                                                              1
                                                                         1
##
                             [Synset('piano.n.01')
                             [Synset('piano.n.01')
                                                              X
## 62
                                                                         b
## 110
                             [Synset('piano.n.01')
                                                              X
                                                                         1
## 4
                              [Synset('bass.n.07')
                                                              1
                                                                         b
                                                              X
##
  71
        [Synset('bowed_stringed_instrument.n.01')
                                                                         b
##
                                                              1
   19
              [Synset('keyboard_instrument.n.01')
                                                                         b
                                                              X
##
   91
              [Synset('stringed_instrument.n.01')
                                                                         b
##
  20
                                                              h
                                                                         h
              [Synset('keyboard_instrument.n.01')
##
  92
              [Synset('stringed instrument.n.01')
                                                              X
                                                                         h
##
  21
                           [Synset('clavier.n.02')
                                                                         b
                                                              b
                           [Synset('clavier.n.02')
##
  93
                                                              X
                                                                         b
  23
                                                              1
                                                                         1
##
                       [Synset('harpsichord.n.01')
  95
                                                              X
                                                                         1
##
                       [Synset('harpsichord.n.01')
##
   5
                              [Synset('bass.n.07')
                                                              1
                                                                         1
                                                              X
##
  99
                            [Synset('guitar.n.01')
                                                                         1
##
  96
              [Synset('stringed_instrument.n.01')
                                                              b
                                                                         b
## 116
                            [Synset('zither.n.01')
                                                              1
                                                                         1
## 6
                              [Synset('bass.n.07')
                                                              b
                                                                         b
                                                              X
## 120
                             [Synset('brass.n.02')
                                                                         b
## 7
                                                              1
                                                                         1
                         [Synset('bass_horn.n.01')
## 121
                         [Synset('bass_horn.n.01')
                                                              X
                                                                         1
                                                                         1
## 8
                         [Synset('bass_horn.n.01')
                                                              1
## 122
                                                              Х
                                                                         1
                         [Synset('bass_horn.n.01')
## 17
              [Synset('keyboard instrument.n.01')
                                                              b
                                                                         b
## 133
             [Synset('free-reed_instrument.n.01')
                                                              X
                                                                         b
## 24
              [Synset('keyboard instrument.n.01')
                                                              b
                                                                         b
```

```
## 141
                  [Synset('wind_instrument.n.01')
                                                             X
                                                                       b
## 9
                              [Synset('bass.n.07')
                                                             1
                                                                       b
                             [Synset('shawm.n.01')
                                                             Х
                                                                       1
## 180
##
       judgmt_a3
## 22
               1
## 31
               1
## 63
               Х
## 94
               X
## 111
               Х
## 13
               b
## 32
               X
## 25
               b
## 57
               Х
               X
## 105
## 26
               1
## 58
                Х
## 106
               X
## 27
               1
## 59
               Х
               Х
## 107
## 28
               1
## 60
               Х
## 108
               X
## 29
               1
               X
## 61
## 109
               Х
## 30
               1
## 62
                Х
## 110
               X
## 4
                b
## 71
                Х
## 19
                b
## 91
                Х
## 20
               b
## 92
                Х
## 21
               1
## 93
               Х
## 23
               1
## 95
                Х
## 5
               b
## 99
               1
## 96
               b
## 116
               Х
## 6
               b
                Х
## 120
## 7
                1
                Х
## 121
## 8
               1
## 122
               X
## 17
               b
## 133
               X
## 24
               b
## 141
               Х
## 9
                1
```

180 X

Synthesiser" RM 32

Piano RM 57, 105

Grand Piano RM 58, 106

Mechanical Piano RM 61, 109

Upright RM 32, 110

Bass fiddle RM 71

Clavichord RM 91

clavier RM 92

Harpsichord RM 93

 ${\bf Virginal} \quad {\rm RM} \ 95$

Bass Guitar RM 5 Because visually closer to guitar

 $\mathbf{Dulcimer} \quad \mathrm{RM} \ /$

Bass Horn RM 120

Euphonium RM 121

 ${\bf Helicon} \quad {\rm RM} \ 122$

Accordion RM 133

Organ RM 141

Bombardon RM 180

In the case where two annotators annotated 'x', that duplicate was prefered for removal.

Removal

```
instruments_rm \leftarrow c(59, 107, 60, 108,63, 94, 111)
bl_instruments_new <- bl_instruments[-instruments_rm,]</pre>
```

```
Get only entries with 100\% agreement on subordinate level NEEDS IMPROVEMENT
fruits_full_agree <- bl_fruits %>%
  filter(judgmt_a1 == judgmt_a2) %>%
  filter(judgmt_a2 == judgmt_a3) %>%
  group_by(judgmt_a1)
fruits_full_agree
## # A tibble: 157 x 8
## # Groups:
              judgmt_a1 [3]
##
      synsets
                tree_depth ancestors judgmt_a1 judgmt_a2 judgmt_a3 synonyms
##
      <chr>
                     <dbl> <chr>
                                       <chr>
                                                 <chr>
                                                           <chr>
                                                                     <chr>
## 1 [Synset('~
                         1 root
                                                                     edible_f~
                                                 h
                                                           h
## 2 [Synset('~
                         2 [Synset('~ b
                                                                     ackee ak~
                                                 b
                                                           b
## 3 [Synset('~
                         2 [Synset('~ b
                                                 b
                                                           b
                                                                     anchovy ~
## 4 [Synset('~
                         2 [Synset('~ b
                                                b
                                                           b
                                                                     apple
## 5 [Synset('~
                         3 [Synset('~ 1
                                                1
                                                           1
                                                                     cooking ~
## 6 [Synset('~
                         4 [Synset('~ 1
                                                 1
                                                           1
                                                                     Bramley'~
## 7 [Synset('~
                         4 [Synset('~ 1
                                                 1
                                                           1
                                                                     Lane's P~
                                                           1
## 8 [Synset('~
                         4 [Synset('~ 1
                                                1
                                                                     Newtown ~
## 9 [Synset('~
                         4 [Synset('~ 1
                                                 1
                                                           1
                                                                     Rome Bea~
                         3 [Synset('~ 1
## 10 [Synset('~
                                                 1
                                                           1
                                                                     crab_app~
## # ... with 147 more rows, and 1 more variable: glossary <chr>
fruits_full_agree_subordinate <- fruits_full_agree %>%
  filter(judgmt_a1 == "1")
fruits_full_agree_subordinate
## # A tibble: 93 x 8
              judgmt_a1 [1]
## # Groups:
                tree_depth ancestors judgmt_a1 judgmt_a2 judgmt_a3 synonyms
      synsets
##
      <chr>
                      <dbl> <chr>
                                       <chr>
                                                 <chr>
                                                           <chr>
                                                                     <chr>>
## 1 [Synset('~
                          3 [Synset('~ 1
                                                 1
                                                           1
                                                                     cooking ~
## 2 [Synset('~
                         4 [Synset('~ 1
                                                 1
                                                           1
                                                                     Bramley'~
## 3 [Synset('~
                         4 [Synset('~ 1
                                                           1
                                                 1
                                                                     Lane's_P~
## 4 [Synset('~
                         4 [Synset('~ 1
                                                 1
                                                           1
                                                                     Newtown_~
## 5 [Synset('~
                         4 [Synset('~ 1
                                                           1
                                                 1
                                                                     Rome_Bea~
## 6 [Synset('~
                         3 [Synset('~ 1
                                                1
                                                           1
                                                                     crab_app~
## 7 [Synset('~
                         3 [Synset('~ 1
                                                 1
                                                           1
                                                                     eating_a~
## 8 [Synset('~
                         4 [Synset('~ 1
                                                           1
                                                 1
                                                                     Baldwin
## 9 [Synset('~
                         4 [Synset('~ 1
                                                           1
                                                                     Cortland
                                                 1
## 10 [Synset('~
                         4 [Synset('~ 1
                                                 1
                                                                     Delicious
```

... with 83 more rows, and 1 more variable: glossary <chr>

```
fruits_full_agree_superordinate <- fruits_full_agree %>%
  filter(judgmt_a1 == "h")
fruits_full_agree_basic <- fruits_full_agree %>%
  filter(judgmt_a1 == "b")
fruit_string <- c("The fruit dataframe of 197 concepts has ",</pre>
                  length(fruits full agree$judgmt a1),
                  " rows where all annotators agree, and of those ",
                  length(fruits_full_agree_subordinate$judgmt_a1),
                  " are of the subordinate level, ",
                  length(fruits_full_agree_superordinate$judgmt_a1),
                  " are superordinate and ",
                  length(fruits_full_agree_basic$judgmt_a1),
                  "are basic.")
#instruments
instruments_full_agree <- bl_instruments %>%
  filter(judgmt_a1 == judgmt_a2) %>%
  filter(judgmt_a2 == judgmt_a3) %>%
  group_by(judgmt_a1)
instruments_full_agree
## # A tibble: 126 x 8
## # Groups:
              judgmt_a1 [3]
##
                tree_depth ancestors judgmt_a1 judgmt_a2 judgmt_a3 synonyms
      synsets
      <chr>
                     <dbl> <chr>
                                      <chr>
                                                                     <chr>
##
                                                <chr>
## 1 [Synset(~
                         1 root
                                      h
                                                h
                                                          h
                                                                    musical_i~
## 2 [Synset(~
                         2 [Synset('~ h
                                                h
                                                          h
                                                                    bass
## 3 [Synset(~
                         3 [Synset('~ b
                                                          b
                                                b
                                                                    bass_horn~
## 4 [Synset(~
                         4 [Synset('~ 1
                                                1
                                                          1
                                                                     euphonium
                         4 [Synset('~ 1
## 5 [Synset(~
                                                1
                                                          1
                                                                    helicon b~
## 6 [Synset(~
                         2 [Synset('~ h
                                                h
                                                          h
                                                                    electroni~
## 7 [Synset(~
                         3 [Synset('~ b
                                                                     synthesiz~
                                                b
                                                          b
## 8 [Synset(~
                         3 [Synset('~ b
                                                          b
                                                                    theremin
                                                h
## 9 [Synset(~
                         2 [Synset('~ b
                                                b
                                                          b
                                                                     jew's_har~
                         2 [Synset('~ h
## 10 [Synset(~
                                                h
                                                          h
                                                                    keyboard_~
## # ... with 116 more rows, and 1 more variable: glossary <chr>
instruments_full_agree_subordinate <- instruments_full_agree %>%
  filter(judgmt_a1 == "1")
instruments_full_agree_subordinate
## # A tibble: 62 x 8
## # Groups:
              judgmt_a1 [1]
      synsets
              tree_depth ancestors judgmt_a1 judgmt_a2 judgmt_a3 synonyms
##
                     <dbl> <chr>
      <chr>
                                      <chr>
                                                <chr>
                                                          <chr>
                                                                     <chr>
## 1 [Synset(~
                         4 [Synset('~ 1
                                                1
                                                          1
                                                                     euphonium
## 2 [Synset(~
                         4 [Synset('~ 1
                                                1
                                                          1
                                                                    helicon b~
## 3 [Synset(~
                         5 [Synset('~ 1
                                                1
                                                          1
                                                                     spinet
```

```
## 6 [Synset(~
                         5 [Synset('~ 1
                                                1
                                                          1
                                                                    baby gran~
                         5 [Synset('~ 1
## 7 [Synset(~
                                                1
                                                          1
                                                                    concert_g~
## 8 [Synset(~
                         4 [Synset('~ 1
                                                1
                                                          1
                                                                    mechanica~
## 9 [Synset(~
                         4 [Synset('~ 1
                                                1
                                                                    upright u~
                                                          1
## 10 [Synset(~
                         5 [Synset('~ 1
                                                                     spinet
## # ... with 52 more rows, and 1 more variable: glossary <chr>
instruments_full_agree_superordinate <- instruments_full_agree %>%
  filter(judgmt_a1 == "h")
instruments_full_agree_basic <- instruments_full_agree %>%
  filter(judgmt_a1 == "b")
instru_string <- c("The instruments dataframe of 192 concepts has",</pre>
                   length(instruments full agree$judgmt a1),
                   " rows where all annotators agree, and of those ",
                   length(instruments_full_agree_subordinate$judgmt_a1),
                   " are of the subordinate level, ",
                   length(instruments_full_agree_superordinate$judgmt_a1),
                   " are superordinate and ",
                   length(instruments_full_agree_basic$judgmt_a1),
                   "are basic.")
#tools
tools_full_agree <- bl_tools %>%
  filter(judgmt_a1 == judgmt_a2) %>%
  filter(judgmt_a2 == judgmt_a3) %>%
  group_by(judgmt_a1)
tools_full_agree
## # A tibble: 133 x 8
## # Groups:
              judgmt a1 [3]
                                       judgmt_a1 judgmt_a2 judgmt_a3 synonyms
##
      synsets
              tree depth ancestors
##
      <chr>
                     <dbl> <chr>
                                       <chr>
                                                 <chr>
                                                           <chr>
                                                                     <chr>>
## 1 [Synset(~
                        1 root
                                       h
                                                 h
                                                           h
                                                                     hand_tool
## 2 [Synset(~
                         2 [Synset('h~ b
                                                 b
                                                           b
                                                                     awl
## 3 [Synset(~
                         3 [Synset('a~ 1
                                                 1
                                                           1
                                                                     bradawl ~
                         3 [Synset('a~ 1
## 4 [Synset(~
                                                 1
                                                           1
                                                                     scriber ~
                         2 [Synset('h~ b
## 5 [Synset(~
                                                 b
                                                           b
                                                                     bevel be~
## 6 [Synset(~
                         2 [Synset('h~ 1
                                                 1
                                                           1
                                                                     bodkin t~
## 7 [Synset(~
                         2 [Synset('h~ b
                                                           b
                                                 b
                                                                     file
## 8 [Synset(~
                         3 [Synset('f~ 1
                                                 1
                                                           1
                                                                     blunt_fi~
                         3 [Synset('f~ 1
                                                           1
## 9 [Synset(~
                                                 1
                                                                     flat_file
## 10 [Synset(~
                         3 [Synset('f~ 1
                                                 1
                                                                     nailfile
## # ... with 123 more rows, and 1 more variable: glossary <chr>
tools_full_agree_subordinate <- tools_full_agree %>%
  filter(judgmt_a1 == "1")
```

4 [Synset(~

5 [Synset(~

5 [Synset('~ 1

4 [Synset('~ 1

1

1

1

1

virginal ~

grand_pia~

```
tools_full_agree_subordinate
## # A tibble: 106 x 8
## # Groups: judgmt_a1 [1]
     synsets tree_depth ancestors judgmt_a1 judgmt_a2 judgmt_a3 synonyms
##
     <chr>
                    <dbl> <chr>
                                    <chr>
                                             <chr>
                                                      <chr>
                                                                 <chr>
## 1 [Synset('~
                        3 [Synset('~ 1
                                             1
                                                                 bradawl ~
                                             1
## 2 [Synset('~
                        3 [Synset('~ 1
                                                      1
                                                                 scriber ~
## 3 [Synset('~
                       2 [Synset('~ 1
                                            1
                                                      1
                                                               bodkin t~
## 4 [Synset('~
                      3 [Synset('~ 1
                                                     1
                                            1
                                                               blunt fi~
                      3 [Synset('~ 1
## 5 [Synset('~
                                            1
                                                      1
                                                               flat file
## 6 [Synset('~
                      3 [Synset('~ 1
                                            1
                                                      1
                                                               nailfile
## 7 [Synset('~
                      3 [Synset('~ 1
                                            1
                                                      1
                                                               rasp woo~
## 8 [Synset('~
                      3 [Synset('~ 1
                                             1
                                                       1
                                                                rat-tail~
## 9 [Synset('~
                        3 [Synset('~ 1
                                             1
                                                       1
                                                                round_fi~
                       3 [Synset('~ 1
                                             1
## 10 [Synset('~
                                                       1
                                                                 taper_fi~
## # ... with 96 more rows, and 1 more variable: glossary <chr>
tools_full_agree_superordinate <- tools_full_agree %>%
  filter(judgmt a1 == "h")
tools_full_agree_basic <- tools_full_agree %>%
  filter(judgmt_a1 == "b")
tool_string <- c("The tools dataframe of 164 concepts has ",
                length(tools_full_agree$judgmt_a1),
                " rows where all annotators agree, and of those ",
                length(tools_full_agree_subordinate$judgmt_a1),
                " are of the subordinate level, ",
                length(tools_full_agree_superordinate$judgmt_a1),
                " are superordinate and ",
                length(tools_full_agree_basic$judgmt_a1),
                "are basic.")
```

Visualizing the data

```
tree_viz_df <- function(synsets, synonyms, ancestors, judg1, judg2, judg3, depth, maxdepth){
    #first third of box
    y <- c()
    x <- c()
    ymin <- c()
    ymax <- c()

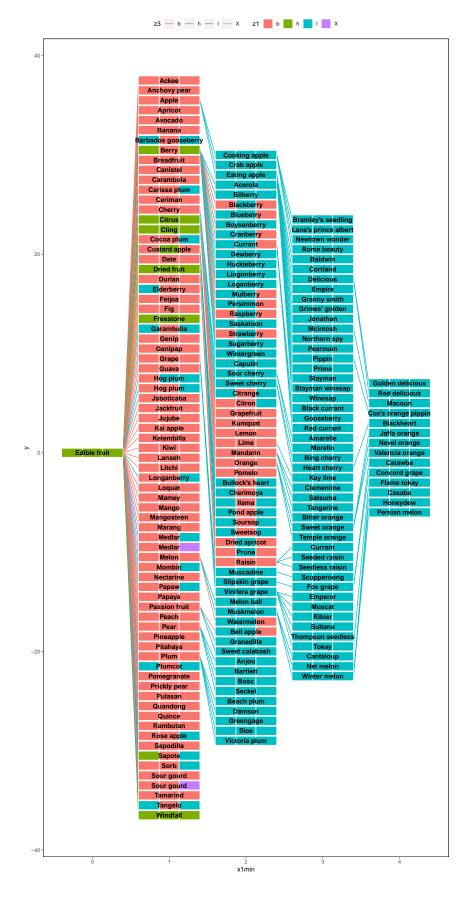
    x1min <- c()
    x1max <- c()
    z1 <- c()
    #second third
    x2min <- c()
    x2max <- c()</pre>
```

```
z2 <- c()
#last third
x3min <- c()
x3max \leftarrow c()
z3 <- c()
#labels and lines
label <- c()</pre>
label raw <- c()</pre>
linedest_x <- c()</pre>
linedest_y <- c()</pre>
for (i in 0:(maxdepth-1)){
  counter <- 0
  depth_len <- length(which(depth==i+1))</pre>
  for (j in 0:(length(depth)-1)){
    if (i+1 == depth[j+1]){
      x \leftarrow append(x, i)
       x1min <- append(x1min, i-0.4)</pre>
      x1max <- append(x1max, i-0.13)</pre>
       z1 <- append(z1, judg1[j+1])</pre>
      x2min <- append(x2min, i-0.13)</pre>
      x2max <- append(x2max, i+0.13)</pre>
       z2 \leftarrow append(z2, judg2[j+1])
      x3min <- append(x3min, i+0.13)</pre>
      x3max \leftarrow append(x3max, i+0.4)
      z3 <- append(z3, judg3[j+1])</pre>
      new_label <- str_to_sentence(</pre>
         str_replace_all(
            str_split(
              synonyms[j+1], " ")[[1]][1], "_", " "))
       label <- append(label, new_label)</pre>
       dupli_bool <- any(synsets[j+1] == label_raw)</pre>
       label_raw <- append(label_raw, synsets[j+1])</pre>
       if(i == 0){
         linedest_x <- append(linedest_x, 0)</pre>
         linedest_y <- append(linedest_y, 0)</pre>
         y \leftarrow append(y, 0)
         ymin <- append(ymin, -0.45)</pre>
         ymax <- append(ymax, 0.45)</pre>
       else{
         ancest_pos <- max(which(match(label_raw,c(ancestors[j+1]))==1))</pre>
         ancest_y <- y[ancest_pos]</pre>
         ancest_x <- x3max[ancest_pos]</pre>
         linedest_x <- append(linedest_x, ancest_x)</pre>
         linedest_y <- append(linedest_y, ancest_y)</pre>
```

```
if(dupli_bool){
             dupli_pos <- which(match(label_raw,c(synsets[j+1]))==1)[1]</pre>
             y <- append(y, y[dupli_pos])</pre>
             ymin <- append(ymin, ymin[dupli_pos])</pre>
             ymax <- append(ymax, ymax[dupli_pos])</pre>
           else {
             y <- append(y, (depth_len/2)-counter)
             ymin <- append(ymin, (depth_len/2)-counter-0.45)</pre>
             ymax <- append(ymax, (depth_len/2)-counter+0.45)</pre>
           }
        }
        counter <- counter +1</pre>
      }
    }
  }
  tree_df <- data.frame(</pre>
    y=y,
    x=x,
    ymin=ymin,
    ymax=ymax,
    label=label,
    xend= linedest x,
    yend= linedest_y,
    x1min=x1min,
    x1max=x1max,
    z1=z1,
    x2min=x2min,
    x2max=x2max,
    z^2=z^2,
    x3min=x3min,
    x3max=x3max,
    z3=z3
    )
  tree_df
make_tree_viz <- function(tree_data){</pre>
  tree <- ggplot(tree_data) +</pre>
  geom_segment(aes(x=x1min,
                     у=у,
                     xend=xend,
                     yend=yend,
                     color=z3)) +
  geom_rect(aes(xmin=x1min,
                 xmax=x1max,
                 ymin=ymin,
                 ymax=ymax,
```

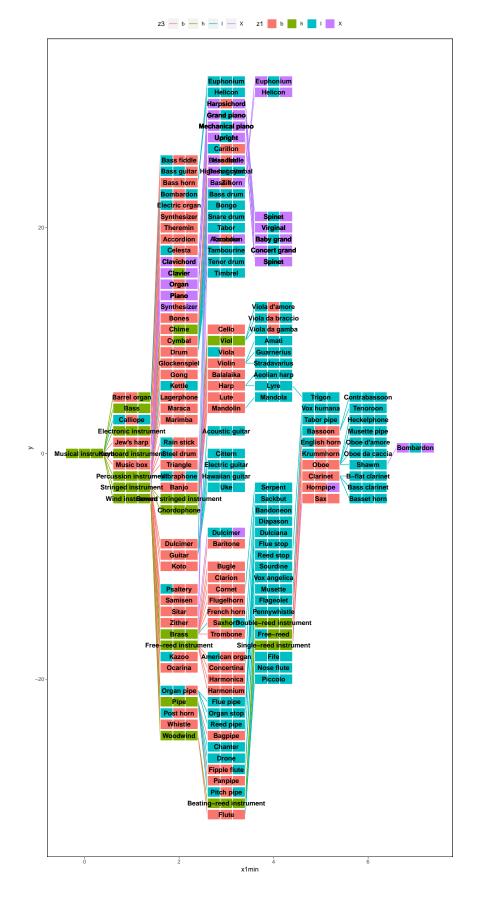
```
fill = z1),
          colour = "white") +
geom_rect(aes(xmin=x2min,
              xmax=x2max,
              ymin=ymin,
              ymax=ymax,
              fill = z2),
          colour = "white") +
geom_rect(aes(xmin=x3min,
              xmax=x3max,
              ymin=ymin,
              ymax=ymax,
              fill = z3),
          colour = "white") +
theme(axis.ticks.y = NULL,
      axis.ticks.x = NULL,
      legend.position = "top",
      panel.grid = NULL,
      line = NULL,
      axis.line = element_blank(),
      title = NULL,
      panel.grid.major = NULL,
      panel.background = NULL,
      panel.grid.minor = NULL) +
geom_text(aes(label=label,
              x=x,
              y=y,
              fontface="bold"))
tree
```

```
fruit_tree_data <- tree_viz_df(
    bl_fruits$synsets,
    bl_fruits$synonyms,
    bl_fruits$ancestors,
    bl_fruits$judgmt_a1,
    bl_fruits$judgmt_a2,
    bl_fruits$judgmt_a3,
    bl_fruits$tree_depth,
    5)</pre>
fruit_tree <- make_tree_viz(fruit_tree_data)
fruit_tree
```



```
instrument_tree_data <- tree_viz_df(
  bl_instruments$synsets,
  bl_instruments$synonyms,
  bl_instruments$ancestors,
  bl_instruments$judgmt_a1,
  bl_instruments$judgmt_a2,
  bl_instruments$judgmt_a3,
  bl_instruments$tree_depth,
  9)

instrument_tree <- make_tree_viz(instrument_tree_data)
instrument_tree</pre>
```



```
tool_tree_data <- tree_viz_df(
  bl_tools$synsets,
  bl_tools$synonyms,
  bl_tools$ancestors,
  bl_tools$judgmt_a1,
  bl_tools$judgmt_a2,
  bl_tools$judgmt_a3,
  bl_tools$tree_depth,
  7)

tool_tree <- make_tree_viz(tool_tree_data)
tool_tree</pre>
```



