tsp_complexity.R

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```
#Installing the packages
#install.packages("pastecs")
#install.packages("qqplot2")
#install.packages("dplyr")
#set workspace to this folder
setwd("D:/Work/IJGIS/R-scripts")
library(pastecs)
## Warning: package 'pastecs' was built under R version 3.5.3
library(ggplot2)
## Warning: package 'ggplot2' was built under R version 3.5.3
library(dplyr)
## Warning: package 'dplyr' was built under R version 3.5.3
## Attaching package: 'dplyr'
## The following objects are masked from 'package:pastecs':
##
##
   first, last
## The following objects are masked from 'package:stats':
##
##
   filter, lag
```

```
##
      intersect, setdiff, setequal, union
##
fun.to.int <- function(file_address, result_address) {</pre>
 raw <- read.table(file = file address, sep = ",")
 processed = data.frame(V1 = c(raw))
 processed$woQ <- gsub("Q-", "", raw$V1)</pre>
 processed$woQA <- gsub("A-", "", processed$woQ)
 write.table(processed$woQA, file=result_address,
             quote = F, sep = " ", row.names = F, col.names = F)
}
fun.to.int("../sequences/prominence-nf-Q.txt",
          "../sequences/prominence-nf-Q-int.txt")
fun.to.int("../sequences/prominence-nf-A.txt",
          "../sequences/prominence-nf-A-int.txt")
fun.to.int("../sequences/scale-nf-Q.txt",
          "../sequences/scale-nf-Q-int.txt")
fun.to.int("../sequences/scale-nf-A.txt",
          "../sequences/scale-nf-A-int.txt")
fun.complexity.swq = function (questions, answers) {
 comp = matrix(nrow = length(questions[,1]), ncol = 3, data = 0)
 for (i in 1:length(questions[,1])) {
   id = questions[i, 1]
   val = questions[i, 2]
   answer = answers[answers$V1 == id, 2:13]
   answer <- answer[!is.na(answer)]</pre>
   complexity = length(answer)
   comp[i,] = c (id, val, complexity)
 return(comp)
fun.complexity.swqt = function (questions, answers) {
 comp = matrix(nrow = length(questions[,1]), ncol = 3, data = 0)
 for (i in 1:length(questions[,1])) {
   id = questions[i, 1]
   val = questions[i, 2]
   answer = answers[answers$V1 == id, 2:13]
   answer <- answer[answer != ""]</pre>
   complexity = length(answer)
   comp[i,] = c (id, val, complexity)
 }
 return(comp)
fun.complexity.dwq = function (questions, answers) {
 comp = matrix(nrow = length(questions[,1]), ncol = 3, data = 0)
 for (i in 1:length(questions[,1])) {
   id = questions[i, 1]
```

The following objects are masked from 'package:base':

```
question = questions[i, 2:length(questions)]
    question = question[!is.na(question)]
    val = min(question)
    answer = answers[answers$V1 == id, 2:13]
    answer <- answer[!is.na(answer)]</pre>
    complexity = length(answer)
    comp[i,] = c (id, val, complexity)
 return(comp)
}
fun.complexity.dwq2 = function (questions, answers) {
  comp = matrix(nrow = length(questions[,1]), ncol = 3, data = 0)
  for (i in 1:length(questions[,1])) {
    id = questions[i, 1]
    question = questions[i, 2:length(questions)]
    question = question[!is.na(question)]
    val = max(question)
    answer = answers[answers$V1 == id, 2:13]
    answer <- answer[!is.na(answer)]</pre>
    complexity = length(answer)
    comp[i,] = c (id, val, complexity)
  }
 return(comp)
}
fun.complexity.dwqt2 = function (questions, answers) {
  comp = matrix(nrow = length(questions[,1]), ncol = 3, data = 0)
  for (i in 1:length(questions[,1])) {
    id = questions[i, 1]
    question = questions[i, ]
    question = question[question != ""]
    val = question[length(question)]
    answer = answers[answers$V1 == id, 2:13]
    answer <- answer[answer != ""]</pre>
    complexity = length(answer)
    comp[i,] = c (id, val, complexity)
  }
 return(comp)
}
fun.complexity.dwqt = function (questions, answers) {
  comp = matrix(nrow = length(questions[,1]), ncol = 3, data = 0)
  for (i in 1:length(questions[,1])) {
    id = questions[i, 1]
    val = questions[i, 2]
    answer = answers[answers$V1 == id, 2:13]
    answer <- answer[answer != ""]</pre>
    complexity = length(answer)
    comp[i,] = c (id, val, complexity)
```

```
return(comp)
fun.extract.ncomplex.ids = function(questions, n) {
  validIds = c()
  counter = 0
  for (i in 1:length(questions[,1])) {
    qVals = questions[i, 2:5]
    if (length(qVals[!is.na(qVals)]) == n) {
      counter= counter + 1
      validIds[counter] = questions[i, 1]
  }
 return (validIds)
fun.extract.ncomplex.type.ids = function(questions, n) {
  validIds = c()
  counter = 0
  for (i in 1:length(questions[,1])) {
    qVals = questions[i, 2:5]
    if (length(qVals[qVals != ""]) == n) {
      counter= counter + 1
      validIds[counter] = questions[i, 1]
    }
  }
  return (validIds)
fun.extract.ncomplex.ids = function(questions, n) {
  validIds = c()
  counter = 0
  for (i in 1:length(questions[,1])) {
    qVals = questions[i, 2:length(questions)]
    if (length(qVals[!is.na(qVals)]) == n) {
      counter= counter + 1
      validIds[counter] = questions[i, 1]
    }
  }
  return (validIds)
fun.agg.stats = function (df) {
  colnames(df) <- c("val", "complexity")</pre>
  df$complexity <- as.numeric(df$complexity)</pre>
  result = df %>% group_by(df[,1]) %>% summarize(count=n(), min=min(complexity), median=median(complexi
  return (result)
}
fun.translate.types = function (question_complexity, type_kb) {
```

```
type_generic_complexity <- as.data.frame(question_complexity, stringsAsFactors=FALSE)
 for (i in 1:length(type_kb$Type_code)) {
   type_generic_complexity[type_generic_complexity$V2 == type_kb$Q_Type_Code[i], 2] = type_kb$ID[i]
 type_generic_complexity[type_generic_complexity$V2 == "Q-", 2] = 10#for unknown!!
 return(type_generic_complexity)
fun.reverse.translate.type.generic = function (aag_type_comp, type_kb) {
 result <- as.data.frame(aag_type_comp)</pre>
 for (i in 1:length(result[,1])) {
   if (result[i,1] == 10) {
     result[i, 1] = "UNK"
   } else {
   result[i, 1] = unique(type_kb[type_kb$ID == result[i, 1], 2])
 }
 return (result)
fun.shared.ids = function (scale_questions, prominence_questions, type_questions) {
 sharedIds = intersect(as.numeric(scale_questions$V1), as.numeric(prominence_questions$V1))
 sharedIds = intersect(sharedIds, as.numeric(type_questions$V1))
 return(sharedIds)
}
q_scale_all <- read.table("../sequences/scale-nf-Q-int.txt",</pre>
                        header = FALSE, sep = " ",
                         col.names = paste0("V",seq_len(4)), fill = TRUE)
a_scale_all <- read.table("../sequences/scale-nf-A-int.txt",</pre>
                         header = FALSE, sep = " ",
                         col.names = paste0("V",seq_len(13)), fill = TRUE)
scale_swq_ids <- fun.extract.ncomplex.ids(q_scale_all, n = 1)</pre>
q_scale_swq <- q_scale_all[q_scale_all$V1 %in% scale_swq_ids, ]</pre>
a_scale_swq <- a_scale_all[a_scale_all$V1 %in% scale_swq_ids, ]</pre>
q_scale_dwq <- q_scale_all[!q_scale_all$V1 %in% scale_swq_ids, ]</pre>
a_scale_dwq <- a_scale_all[!a_scale_all$V1 %in% scale_swq_ids, ]</pre>
q_prom_all <- read.table("../sequences/prominence-nf-Q-int.txt",</pre>
                       header = FALSE, sep = " ",
                       col.names = paste0("V", seq_len(5)), fill = TRUE)
a_prom_all <- read.table("../sequences/prominence-nf-A-int.txt",</pre>
                        header = FALSE, sep = " ",
                         col.names = paste0("V",seq_len(15)), fill = TRUE)
```

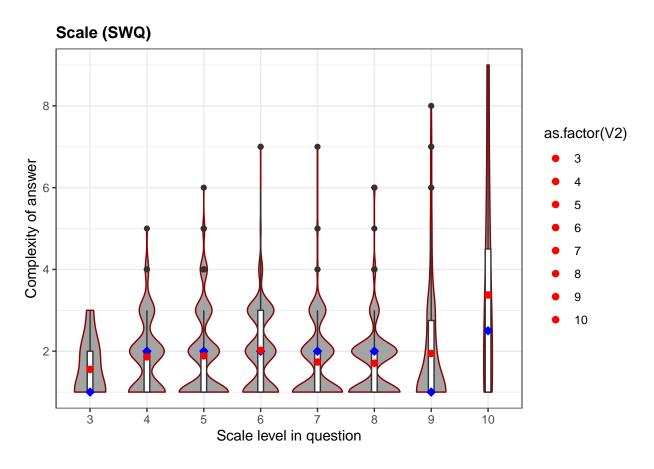
```
prom_swq_ids <- fun.extract.ncomplex.ids(q_prom_all, n = 1)</pre>
q_prom_swq <- q_prom_all[q_prom_all$V1 %in% prom_swq_ids, ]</pre>
a_prom_swq <- a_prom_all[a_prom_all$V1 %in% prom_swq_ids, ]</pre>
q_prom_dwq <- q_prom_all[!q_prom_all$V1 %in% prom_swq_ids, ]</pre>
a_prom_dwq <- a_prom_all[!a_prom_all$V1 %in% prom_swq_ids, ]</pre>
type_kb <- read.csv("../gazetteers/type_geonames.csv", header=TRUE, stringsAsFactors = FALSE)
colnames(type_kb) <- c("ID", "Generic_Code", "Type_code", "Q_Type_Code", "Desc_short")</pre>
q_type_all <- read.table("../sequences/type-nf-Q.txt",</pre>
                         header = FALSE, sep = " ",
                         col.names = paste0("V",seq_len(5)), fill = TRUE, stringsAsFactors=FALSE)
a_type_all <- read.table("../sequences/type-nf-A.txt",</pre>
                          header = FALSE, sep = " ",
                          col.names = paste0("V",seq_len(15)), fill = TRUE, stringsAsFactors=FALSE)
type_swq_ids <- fun.extract.ncomplex.type.ids(q_type_all, n = 1)</pre>
q_type_swq <- q_type_all[q_type_all$V1 %in% type_swq_ids, ]</pre>
a_type_swq <- a_type_all[a_type_all$V1 %in% type_swq_ids, ]</pre>
q_type_dwq <- q_type_all[!q_type_all$V1 %in% type_swq_ids, ]</pre>
a_type_dwq <- a_type_all[!a_type_all$V1 %in% type_swq_ids, ]</pre>
scale_swq_comp <- as.data.frame(fun.complexity.swq(q_scale_swq, a_scale_swq))</pre>
scale_dwq_comp <- as.data.frame(fun.complexity.dwq(q_scale_dwq, a_scale_dwq)) #min</pre>
scale_dwq_comp2 <- as.data.frame(fun.complexity.dwq2(q_scale_dwq, a_scale_dwq)) #max</pre>
scale_all_comp <- as.data.frame(fun.complexity.dwq(q_scale_all, a_scale_all)) #min</pre>
prom_swq_comp <- as.data.frame(fun.complexity.swq(q_prom_swq, a_prom_swq))</pre>
prom_dwq_comp <- as.data.frame(fun.complexity.dwq(q_prom_dwq, a_prom_dwq)) #min</pre>
prom_dwq_comp2 <- as.data.frame(fun.complexity.dwq2(q_prom_dwq, a_prom_dwq)) #max</pre>
prom_all_comp <- as.data.frame(fun.complexity.dwq(q_prom_all, a_prom_all)) #min</pre>
type_swq_comp <- as.data.frame(</pre>
 fun.complexity.swqt(q_type_swq, a_type_swq), stringsAsFactors=FALSE)
type dwg comp <- as.data.frame(</pre>
 fun.complexity.dwqt(q_type_dwq, a_type_dwq), stringsAsFactors=FALSE) #first
type_dwq_comp2 <- as.data.frame(</pre>
 fun.complexity.dwqt2(q_type_dwq, a_type_dwq), stringsAsFactors=FALSE) #last
type_all_comp <- as.data.frame(</pre>
 fun.complexity.dwqt(q_type_all, a_type_all), stringsAsFactors=FALSE) #first
type_agg_swq_comp <- fun.translate.types(type_swq_comp, type_kb)</pre>
type_agg_dwq_comp <- fun.translate.types(type_dwq_comp, type_kb)#first</pre>
type_agg_dwq_comp2 <- fun.translate.types(type_dwq_comp2, type_kb)#last
```

```
type_agg_all_comp <- fun.translate.types(type_all_comp, type_kb)#first
shared_ids_all <- fun.shared.ids(q_scale_all, q_prom_all, q_type_all) #3932 all shared ones
shared_ids_swq <- fun.shared.ids(q_scale_swq, q_prom_swq, q_type_swq) #1983 shared swqs
shared_ids_dwq <- fun.shared.ids(q_scale_dwq, q_prom_dwq, q_type_dwq) #1949 shared dwqs
q_type_shared_swq <- q_type_swq[as.numeric(q_type_swq$V1) %in% shared_ids_swq, ]
a_type_shared_swq <- a_type_swq[as.numeric(a_type_swq$V1) %in% shared_ids_swq, ]
q_type_shared_dwq <- q_type_dwq[as.numeric(q_type_dwq$V1) %in% shared_ids_dwq, ]
a_type_shared_dwq <- a_type_dwq[as.numeric(a_type_dwq$V1) %in% shared_ids_dwq, ]
type_swq_comp_shared <- as.data.frame(</pre>
 fun.complexity.swqt(q_type_shared_swq, a_type_shared_swq), stringsAsFactors=FALSE)
type_dwq_comp_shared <- as.data.frame(</pre>
 fun.complexity.dwqt(q_type_shared_dwq, a_type_shared_dwq), stringsAsFactors=FALSE) #first
stat_type_swq_shared <- stat.desc(as.numeric(type_swq_comp_shared$V3))[4:14]
stat_type_dwq_shared <- stat.desc(as.numeric(type_dwq_comp_shared$V3))[4:14]
summary(as.numeric(type_swq_comp_shared$V3))
##
     Min. 1st Qu. Median
                          Mean 3rd Qu.
                                           Max
##
    1.000
          1.000 2.000
                           2.292 3.000 12.000
summary(as.numeric(type_dwq_comp_shared$V3))
     Min. 1st Qu. Median
##
                            Mean 3rd Qu.
                                           Max.
##
    1.000
          1.000
                   2,000
                           1.912
                                  2.000 12.000
#CONCLUSION: DWQ is less complex compared to SWQ:: based on mean, and variance! (scale)
#TYPE as the most complete one!
stat_type_swq <- stat.desc(as.numeric(type_swq_comp$V3))[4:14]
stat_type_dwq <- stat.desc(as.numeric(type_dwq_comp$V3))[4:14]</pre>
#CONCLUSION: DWQ is less complex compared to SWQ:: based on mean, and variance! (scale)
summary(as.numeric(type_swq_comp$V3))
##
     Min. 1st Qu. Median
                            Mean 3rd Qu.
                                           Max.
##
          1.000
                   2.000
                           2,206
                                  3.000 12.000
summary(as.numeric(type dwg comp$V3))
##
     Min. 1st Qu. Median
                           Mean 3rd Qu.
                                           Max.
     1.00 1.00
                    2.00
                                   2.00
##
                            1.88
                                          12.00
swqVsdwq = matrix(ncol = 12, nrow = 6, data = 0)
colnames(swqVsdwq) <- c("type", names(stat_type_dwq))</pre>
swqVsdwq[1, 1] = as.character("Shared Sequences")
swqVsdwq[2, 1] = as.character("SWQ")
```

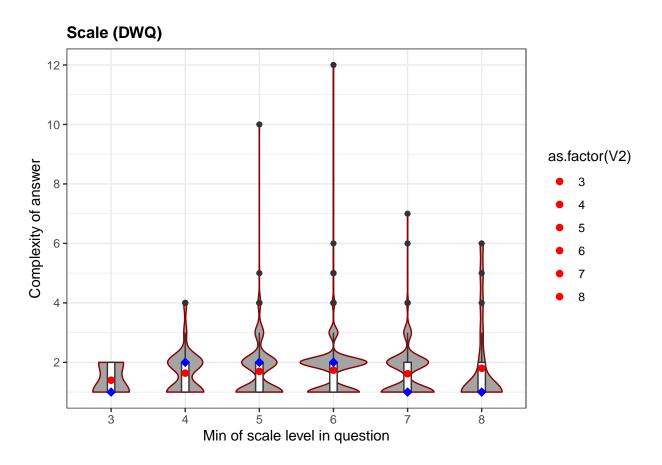
```
swqVsdwq[2, 2:12] = stat_type_swq_shared
swqVsdwq[3, 1] = as.character("DWQ")
swqVsdwq[3, 2:12] = stat_type_dwq_shared
swqVsdwq[4, 1] = as.character("Type Sequences")
swqVsdwq[5, 1] = as.character("SWQ")
swqVsdwq[5, 2:12] = stat_type_swq
swqVsdwq[6, 1] = as.character("DWQ")
swqVsdwq[6, 2:12] = stat_type_dwq
pwbsVpwa
##
       type
                                 range sum
                                             median mean
                         min max
## [1,] "Shared Sequences" "0" "0"
                                 "0"
                                       "0"
                                             "0"
## [2,] "SWQ"
                         "1" "12" "11"
                                       "4350" "2"
                                                    "2.29188619599579"
                         "1" "12" "11" "3556" "2"
## [3,] "DWQ"
                                                    "1.91182795698925"
## [4,] "Type Sequences"
                                             "0"
                         "0" "0" "0"
                                       "0"
                         "1" "12" "11"
                                       "7098" "2"
                                                    "2.20571783716594"
## [5,] "SWQ"
## [6,] "DWQ"
                         "1" "12" "11" "5429" "2"
                                                    "1.88049878766886"
##
       SE.mean
                         CI.mean.0.95
## [1.] "0"
## [2,] "0.0303124017227229" "0.05944914626826"
                                              "1.7439615431831"
## [3,] "0.0239147831818559" "0.0469026509477319" "1.06376534962143"
## [4,] "0"
## [5,] "0.0226986702291327" "0.0445053207289192" "1.65800894989001"
## [6,] "0.0195355858903169" "0.0383051094951428" "1.10179212811703"
##
       std.dev
                         coef.var
## [1,] "0"
                         "0"
## [2,] "1.3205913611648" "0.576202851377193"
## [3,] "1.03139000849409" "0.539478463385545"
## [4,] "0"
                         "0"
## [5,] "1.28763696354602" "0.583772294828273"
## [6,] "1.04966286402684" "0.558183217617516"
write.csv(file = "result/swqVsdwq.csv", x = swqVsdwq, row.names = F)
names_agg <- c("value", "count", "min", "median", "mean", "max")</pre>
agg_stats_scale_all <- fun.agg.stats(scale_all_comp[,2:3])</pre>
names(agg_stats_scale_all) <- names_agg</pre>
agg_stats_scale_all
## # A tibble: 8 x 6
    value count
                 min median mean
    <dbl> <int> <dbl>
                     <dbl> <dbl> <dbl>
##
## 1
        3
            14
                        1
                            1.5
                                     3
                   1
          216
                        2
                            1.78
                                     5
## 2
        4
                   1
## 3
          523
                            1.81
                                    10
                   1
        6 1905
                        2
                            1.85
## 4
                   1
                                    12
## 5
        7
           613
                   1
                        1
                            1.66
                                     7
## 6
        8
          378
                   1
                        2
                            1.71
                                     6
       9 110
                            1.95
                                     8
## 7
                   1
                        2.5 3.38
                                     9
## 8
       10
             8
                   1
```

```
write.csv(file = "result/scale_all.csv", x = agg_stats_scale_all, row.names = F)
agg_stats_scale_swq <- fun.agg.stats(scale_swq_comp[,2:3])</pre>
agg_stats_scale_dwq <- fun.agg.stats(scale_dwq_comp[,2:3])</pre>
agg_stats_scale_dwq2 <- fun.agg.stats(scale_dwq_comp2[,2:3])</pre>
agg stats prom all <- fun.agg.stats(prom all comp[,2:3])
names(agg_stats_prom_all) <- names_agg</pre>
agg_stats_prom_all
## # A tibble: 7 x 6
     value count
                   min median mean
     <dbl> <int> <dbl> <dbl> <dbl> <dbl> <dbl> <
##
## 1
         1
             483
                            2 1.95
                    1
                                        12
## 2
         2 1702
                            2 2.04
                                        9
                     1
         3 1809
                            2 2.03
## 3
                     1
                                        10
                            2 2.01
## 4
         4
           871
                     1
                                        12
## 5
         5
            473
                     1
                            2 1.91
                                         8
         6 436
                            2 1.98
                                        10
## 6
                     1
## 7
         7 122
                            2 1.89
                                         7
                     1
write.csv(file = "result/prominence_all.csv", x = agg_stats_prom_all, row.names = F)
agg_stats_prom_swq <- fun.agg.stats(prom_swq_comp[,2:3])</pre>
agg_stats_prom_dwq <- fun.agg.stats(prom_dwq_comp[,2:3])</pre>
agg_stats_prom_dwq2 <- fun.agg.stats(prom_dwq_comp2[,2:3])</pre>
agg_stats_type_all <- fun.agg.stats(type_all_comp[,2:3])</pre>
names(agg_stats_type_all) <- names_agg</pre>
agg_stats_type_all
## # A tibble: 187 x 6
##
      value count
                      min median mean
                                          max
##
                           <dbl> <dbl> <dbl>
      <chr>
              <int> <dbl>
                                   2.02
## 1 Q-
                480
                             2
                                            6
                        1
                                  1.91
                424
                              2
## 2 Q-ADM1
                                            8
## 3 Q-ADM1H
                              2
                                   2
                                            3
                 3
                        1
## 4 Q-ADM2
                797
                        1
                              2
                                  1.84
                                            9
## 5 Q-ADM2H
                             2
                                   2
                                            3
                2
                        1
## 6 Q-ADM3
                209
                        1
                             2
                                  2.32
                                            7
## 7 Q-ADM4
                170
                             2
                                   2.15
                                            7
                        1
## 8 Q-ADM4H
                  2
                        2
                             2.5 2.5
                                            3
## 9 Q-ADM5
                                            2
                  7
                        1
                             2
                                   1.57
## 10 Q-ADMD
                 37
                                   2.03
## # ... with 177 more rows
write.csv(file = "result/type_all.csv", x = agg_stats_type_all, row.names = F)
```

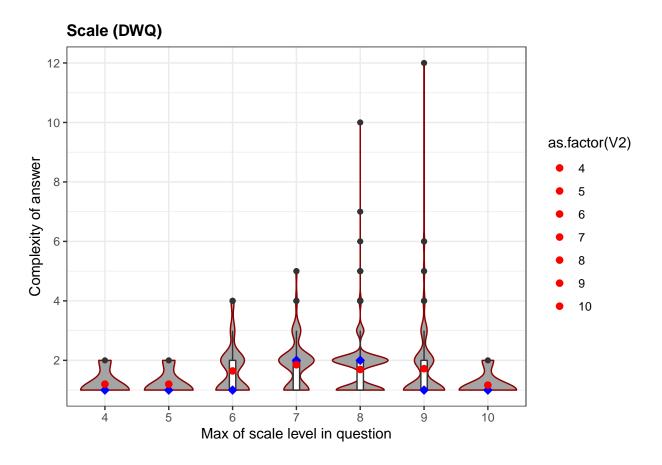
```
agg_stats_generic_type_all <- fun.agg.stats(type_agg_all_comp[,2:3])</pre>
names(agg_stats_generic_type_all) <- names_agg</pre>
write.csv(file = "result/gtype_all.csv", x = agg_stats_generic_type_all, row.names = F)
agg_ngstats_type_swq <- fun.agg.stats(type_swq_comp[,2:3])</pre>
agg_ngstats_type_dwq <- fun.agg.stats(type_dwq_comp[,2:3])</pre>
agg ngstats type dwq2 <- fun.agg.stats(type dwq comp2[,2:3])
type_agg_swq_comp[,2] <- as.numeric(type_agg_swq_comp[,2])</pre>
type_agg_swq_comp[,3] <- as.numeric(type_agg_swq_comp[,3])</pre>
agg_stats_type_swq <- fun.agg.stats(type_agg_swq_comp[,2:3])</pre>
type_agg_dwq_comp[,2] <- as.numeric(type_agg_dwq_comp[,2])</pre>
type_agg_dwq_comp[,3] <- as.numeric(type_agg_dwq_comp[,3])</pre>
agg_stats_type_dwq <- fun.agg.stats(type_agg_dwq_comp[,2:3])</pre>
type_agg_dwq_comp2[,2] <- as.numeric(type_agg_dwq_comp2[,2])</pre>
type_agg_dwq_comp2[,3] <- as.numeric(type_agg_dwq_comp2[,3])</pre>
agg_stats_type_dwq2 <- fun.agg.stats(type_agg_dwq_comp2[,2:3])
ggplot(scale swq comp, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
 geom violin(fill='#A4A4A4', color="darkred") +
 geom boxplot(width=0.1, fill="white") +
 stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
 stat_summary(fun.y=mean, geom="point", size=2, color="red") +
 labs(title="Scale (SWQ)",x="Scale level in question", y = "Complexity of answer") +
 theme_minimal() + theme_bw() +
 theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
 scale_y_continuous(breaks=seq(0,12,2))
```



```
ggplot(scale_dwq_comp, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
  geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
  stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
  stat_summary(fun.y=mean, geom="point", size=2, color="red") +
  labs(title="Scale (DWQ)",x="Min of scale level in question", y = "Complexity of answer") +
  theme_minimal() + theme_bw() +
  theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
  scale_y_continuous(breaks=seq(0,12,2))
```

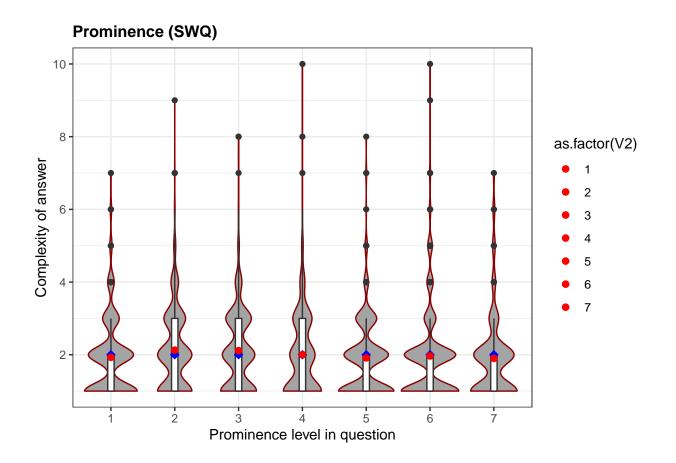


```
ggplot(scale_dwq_comp2, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
  geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
  stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
  stat_summary(fun.y=mean, geom="point", size=2, color="red") +
  labs(title="Scale (DWQ)",x="Max of scale level in question", y = "Complexity of answer") +
  theme_minimal() + theme_bw() +
  theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
  scale_y_continuous(breaks=seq(0,12,2))
```

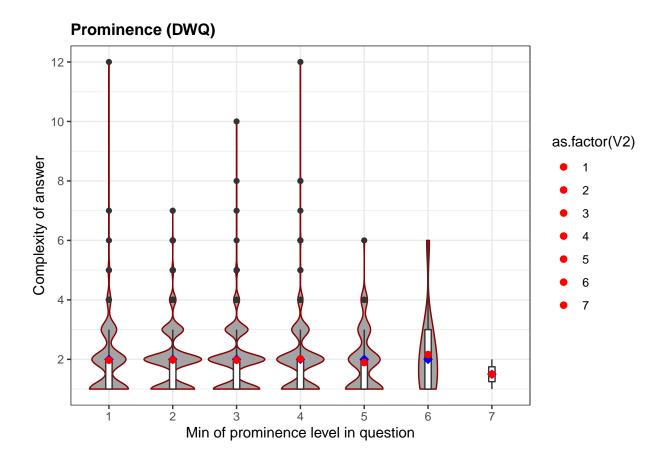


```
#CONCLUSION: 1- SWQ vs. DWQ --> White Box --> less complex!

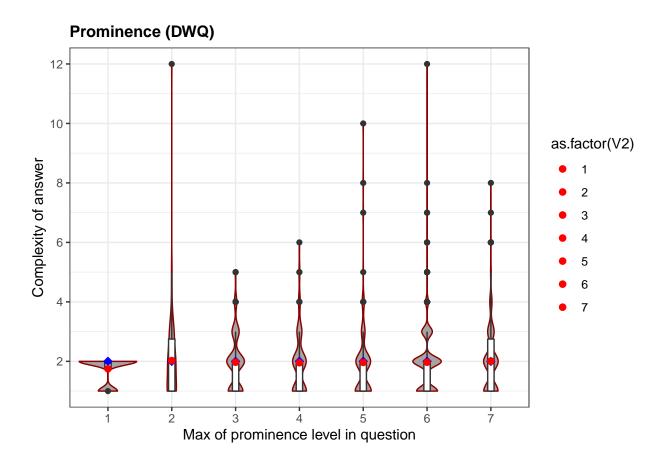
ggplot(prom_swq_comp, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
    geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
    stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
    stat_summary(fun.y=mean, geom="point", size=2, color="red") +
    labs(title="Prominence (SWQ)",x="Prominence level in question", y = "Complexity of answer") +
    theme_minimal() + theme_bw() +
    theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
    scale_y_continuous(breaks=seq(0,12,2))
```



```
ggplot(prom_dwq_comp, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
  geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
  stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
  stat_summary(fun.y=mean, geom="point", size=2, color="red") +
  labs(title="Prominence (DWQ)",x="Min of prominence level in question", y = "Complexity of answer") +
  theme_minimal() + theme_bw() +
  theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
  scale_y_continuous(breaks=seq(0,12,2))
```



```
ggplot(prom_dwq_comp2, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
  geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
  stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
  stat_summary(fun.y=mean, geom="point", size=2, color="red") +
  labs(title="Prominence (DWQ)",x="Max of prominence level in question", y = "Complexity of answer") +
  theme_minimal() + theme_bw() +
  theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
  scale_y_continuous(breaks=seq(0,12,2))
```



```
#CONCLUSION: 1- SWQ vs. DWQ --> White Box --> less complex!

type_swq_comp_generic <- fun.reverse.translate.type.generic(type_agg_swq_comp[,2:3], type_kb)

ggplot(type_swq_comp_generic, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +

geom_violin(fill='#A4A4A44', color="darkred") + geom_boxplot(width=0.1, fill="white") +

stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +

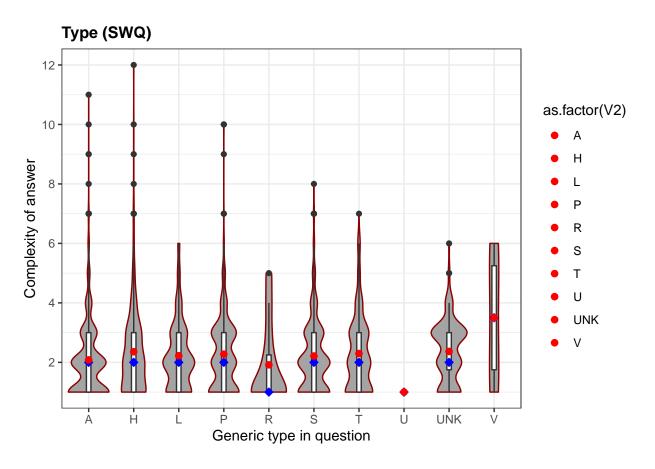
stat_summary(fun.y=mean, geom="point", size=2, color="red") +

labs(title="Type (SWQ)",x="Generic type in question", y = "Complexity of answer") +

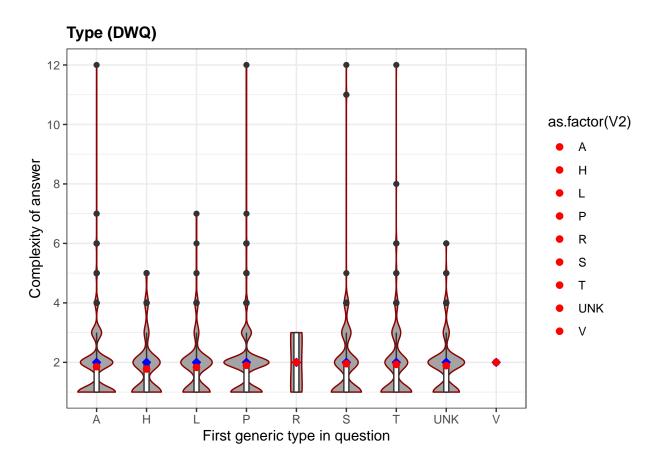
theme_minimal() + theme_bw() +

theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +

scale_y_continuous(breaks=seq(0,12,2))</pre>
```



```
type_dwq_comp_generic <- fun.reverse.translate.type.generic(type_agg_dwq_comp[,2:3], type_kb)
ggplot(type_dwq_comp_generic, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
    geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
    stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
    stat_summary(fun.y=mean, geom="point", size=2, color="red") +
    labs(title="Type (DWQ)",x="First generic type in question", y = "Complexity of answer") +
    theme_minimal() + theme_bw() +
    theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
    scale_y_continuous(breaks=seq(0,12,2))</pre>
```



```
type_dwq_comp_generic2 <- fun.reverse.translate.type.generic(type_agg_dwq_comp2[,2:3], type_kb)
ggplot(type_dwq_comp_generic2, aes(x=as.factor(V2), y=V3, fill = as.factor(V2))) +
    geom_violin(fill='#A4A4A4', color="darkred") + geom_boxplot(width=0.1, fill="white") +
    stat_summary(fun.y=median, geom="point", shape=23, size=2, color="blue", fill="blue") +
    stat_summary(fun.y=mean, geom="point", size=2, color="red") +
    labs(title="Type (DWQ)",x="First generic type in question", y = "Complexity of answer") +
    theme_minimal() + theme_bw() +
    theme(plot.title = element_text(color = "black", size = "12", face = "bold")) +
    scale_y_continuous(breaks=seq(0,12,2))</pre>
```

