Who falls for Misinformation?

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Data Source

I obtained the dataset from a repository publicly shared by the authors of a published article. Link to the article For this article, the authors used the dataset to run a Confirmatory Factor Analysis. The sample is entirely from Africa, by design. The dataset represents a total of 21 African countries. I used the dataset to run a multiple regression to find out what factors predict the subscription of COVID-related misinformation.

```
library(readxl)
cad <- read_excel("covid_africa_data.xlsx")</pre>
dim(cad)
## [1] 563
            35
head(cad, 10)
## # A tibble: 10 x 35
                                             'Highest level of ed~ 'Country of Orig~
##
      Timestamp
                        Gender 'Age class'
##
      <chr>
                         <chr>
                               <chr>
                                             <chr>
                                                                    <chr>
##
   1 2020/03/31 1:18:~ Male
                               35 - 39 yea~ Post Graduate level
                                                                    Nigeria
                                                                    Nigeria
##
   2 2020/03/31 1:26:~ Male
                               40 - 49 yea~ Post Graduate level
   3 2020/03/31 1:34:~ Male
                                35 - 39 yea~ Post Graduate level
                                                                    Nigeria
   4 2020/03/31 1:34:~ Female 25 - 29 yea~ Post Graduate level
                                                                    Nigeria
##
   5 2020/03/31 1:35:~ Male
                               30 - 34 yea~ Tertiary education
                                                                    Nigeria
##
##
   6 2020/03/31 1:35:~ Male
                               35 - 39 yea~ Post Graduate level
                                                                    Nigeria
                               30 - 34 yea~ Tertiary education
   7 2020/03/31 1:35:~ Male
                                                                    Nigeria
                               18 - 24 yea~ Post Graduate level
##
   8 2020/03/31 1:35:~ Male
                                                                    Nigeria
   9 2020/03/31 1:42:~ Male
                               18 - 24 yea~ Tertiary education
                                                                    Nigeria
## 10 2020/03/31 1:42:~ Female 40 - 49 yea~ Post Graduate level
                                                                    Nigeria
## # ... with 30 more variables: Region of your country <chr>,
       Religion faith/belief <chr>, Know_a_covid_patient <chr>,
## #
## #
       Source of information about Coronavirus (COVID19). Please tick as many as applicable. <chr>,
## #
       If you will love to receive a copy of the published work, please include your email address below
       q1 <chr>, q2 <chr>, q3 <chr>, q4 <chr>, q5 <chr>, q6 <chr>, q7 <chr>,
       q8 <chr>, q9 <chr>, q10 <chr>, q11 <chr>, q12 <chr>, q13 <chr>,
## #
       Coronavirus (COVID19) has taught us humility and draw humanity closer to GOD. <chr>, ...
glimpse(cad)
```

Rows: 563

```
## Columns: 35
## $ Timestamp
## $ Gender
## $ 'Age class'
## $ 'Highest level of education'
## $ 'Country of Origin'
## $ 'Region of your country'
## $ 'Religion faith/belief'
## $ Know_a_covid_patient
## $ 'Source of information about Coronavirus (COVID19). Please tick as many as applicable.'
## $ 'If you will love to receive a copy of the published work, please include your email address below
## $ q1
## $ q2
## $ q3
## $ q4
## $ q5
## $ q6
## $ a7
## $ q8
## $ q9
## $ q10
## $ q11
## $ q12
## $ q13
## $ 'Coronavirus (COVID19) has taught us humility and draw humanity closer to GOD.'
## $ 'Rubbing of Anointing Oil (or prayer ablution) on the body can prevent/resist COVID19.'
## $ 'Coronavirus (COVID19) cannot affect believers.'
## $ 'Coronavirus (COVID19) cannot be contracted in the Church/Mosque.'
## $ 'Coronavirus (COVID19) is a divine punishment from God to humanity.'
## $ 'Social distancing in Africa is in theory, it cannot be practice.'
## $ 'Total lockdown in Africa will cause a more dangerous hunger outbreak than the COVID19 itself.'
## $ 'The media is causing more panicking about COVID19 than it should.'
## $ 'There are many other dangerous diseases (e.g. Malaria, Cancer, etc) that kill more people daily to
## $ 'Hunger kills more than COVID19.'
## $ 'Thank you for your time! Please leave us with any comments about COVID19 you think we should incl
## $ 'Kindly provide your name if you will want us to list your name in the appreciation section of thi
```

The dataset was in csv file, which I downloaded and saved as an Excel worksheet. I then subsetted the dataset to include only the variables needed for my analysis. Two variables pertaining to the source of covid information and religious orientation could be included in the model but I opted not to use them. FOr the former, the questionnaire gave multiple choices on COVID information source and most participants chose various options. For religion, vast majority chose Christianity and Islam, with only a handful with 'don't want to tell'/'other'/'neutral'. It would basically be comparing one religion vs another.

Reshaping the dataset

Here I select only the variables that are of use for my analysis.

Data Wrangling

Here I recategorieze some variables to make them more readable.

```
table(df1$age_group)
##
                                                  30 - 34 years
##
        18 - 24 years
                             25 - 29 years
                                                                       35 - 39 years
##
##
        40 - 49 years
                             50 - 59 years
                                                  60 - 69 years 70 years and above
##
                    86
## Less than 18 years
##
# collapsing age class varible to three categories
levels(df1$age_group) <- list("Youths" = c("Less than 18 years", "18 - 24 years", "25 - 29 years"),</pre>
                          "Adults" = c("30 - 34 \text{ years}", "35 - 39 \text{ years}", "40 - 49 \text{ years}"),
                          "Elderly" = c("50 - 59 \text{ years}", "60 - 69 \text{ years}", "70 \text{ years and above}"))
sum(is.na(df1$age_group)) #checking missing values
## [1] 0
levels(df1$education) <- list("college_educated" = c("Tertiary education", "Post Graduate level"),</pre>
                                 "No_college" = c("No formal education", "Primary/Basic education", "Secon
sum(is.na(cad$`Highest level of education`))
## [1] 0
sum(is.na(df1$education))
## [1] 0
```

Collapsing various age groups into three general groups made sense to see the age effect with better clarity. Collapsing various education levels into two groups (college educated or not) facilitated a plain comparison.

More Data Manipulation

Here, I first convert the likert scale texts into their numerical equivalents as suggested by the data source. Then I aggregate the misinformation related columns taking average.

```
df1[df1 == "Strongly Disagree"] <- "0"
df1[df1 == "Disagree"] <- "0"
df1[df1 == "Neutral"] <- "1"
df1[df1=="Agree"] <- "4"
df1[df1=="Strongly Agree"] <- "4"
head(df1)</pre>
```

```
## # A tibble: 6 x 17
     gender age_group education familiarity q1
                                                       q2
                                                             q3
                                                                   q4
                                                                         q5
     <fct> <fct>
                      <fct>
                                                 <chr> <chr> <chr> <chr> <chr> <chr> <chr>
## 1 Male
            Adults
                      college_educ~ No
                                                 0
                                                       1
                                                             1
## 2 Male
            Adults
                      college_educ~ No
                                                 4
                                                       1
                                                                   1
## 3 Male
            Adults college educ~ No
                                                 0
                                                       0
                                                             0
                                                                         0
                                                                   1
## 4 Female Youths
                      college educ~ No
                                                       1
## 5 Male
            Adults
                      college_educ~ No
                                                 1
                                                       1
                                                             1
                                                                          1
                      college_educ~ No
## 6 Male
            Adults
                                                 1
                                                       1
## # ... with 7 more variables: q7 <chr>, q8 <chr>, q9 <chr>, q10 <chr>,
## # q11 <chr>, q12 <chr>, q13 <chr>
class(df1$q1)
## [1] "character"
df1[, 5:17] <- lapply(df1[, 5:17], as.numeric)</pre>
class(df1$q1)
## [1] "numeric"
head(df1)
## # A tibble: 6 x 17
     gender age_group education
                                    familiarity
                                                    q1
                                                          q2
                                                                q3
                                                                      q4
     <fct> <fct>
                      <fct>
                                                 <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
                                     <fct>
## 1 Male
            Adults
                      college_educ~ No
                                                     0
                                                                 1
## 2 Male
            Adults
                      college_educ~ No
                                                     4
                                                                             4
                                                                                    1
                                                           1
                                                                 1
                                                                       1
## 3 Male
            Adults
                      college_educ~ No
                                                     0
                                                           0
                                                                 0
                                                                                    0
## 4 Female Youths
                      college_educ~ No
                                                                 0
                                                                                    1
                                                           1
                                                     1
## 5 Male
            Adults
                      college educ~ No
                                                                 1
                                                                       1
                                                                             1
                                                                                    1
## 6 Male
          Adults
                      college_educ~ No
                                                                                    1
                                                     1
                                                           1
## # ... with 7 more variables: q7 <dbl>, q8 <dbl>, q9 <dbl>, q10 <dbl>,
## # q11 <dbl>, q12 <dbl>, q13 <dbl>
df1$q <- rowMeans(subset(df1, select = q1:q13), na.rm = T)</pre>
head(df1)
## # A tibble: 6 x 18
##
     gender age_group education
                                    familiarity
                                                    q1
                                                          q2
                                                                q3
                                                                      q4
                                                                            q5
                                                                                   q6
     <fct> <fct>
                      <fct>
                                                 <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
## 1 Male
            Adults
                      college_educ~ No
                                                     0
                                                                             4
                                                                                    0
                                                           1
                                                                 1
## 2 Male
            Adults
                      college_educ~ No
                                                     4
                                                                                    1
                                                                 0
                                                                                    0
## 3 Male
            Adults
                      college_educ~ No
                                                     0
                                                           0
                                                                       1
## 4 Female Youths
                      college_educ~ No
                                                                 0
                                                                                    1
                                                     1
## 5 Male
            Adults
                      college_educ~ No
                                                                             1
                                                                                    1
                                                           1
                                                                 1
                                                                       1
## 6 Male
            Adults
                      college_educ~ No
                                                                                    1
## # ... with 8 more variables: q7 <dbl>, q8 <dbl>, q9 <dbl>, q10 <dbl>,
## # q11 <dbl>, q12 <dbl>, q13 <dbl>, q <dbl>
```

```
df <- df1 %>% select(gender, age_group, education, familiarity, q )
head(df)
```

```
## # A tibble: 6 x 5
##
     gender age_group education
                                         familiarity
            <fct>
                       <fct>
                                                     <dbl>
     <fct>
## 1 Male
            Adults
                       college_educated No
                                                     1.46
## 2 Male
            Adults
                       college_educated No
                                                     2.08
## 3 Male
            Adults
                       college_educated No
                                                     0.462
## 4 Female Youths
                       college_educated No
                                                     1.62
                       college_educated No
## 5 Male
            Adults
                                                     1
## 6 Male
            Adults
                       college_educated No
                                                     2.15
```

Here, q is the outcome variable and represents the extent to which one is misinformed about COVID (subscribes to COVID related misinformation) ## Regression

```
model <- lm(q~gender+age_group+education+familiarity, data = df)
summary(model)</pre>
```

```
##
## Call:
## lm(formula = q ~ gender + age_group + education + familiarity,
##
       data = df
##
## Residuals:
##
        Min
                       Median
                                    3Q
                  1Q
                                            Max
## -1.46375 -0.61969 -0.08445 0.45401
##
## Coefficients:
##
                       Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                        1.47594
                                   0.06563
                                           22.490
                                                    < 2e-16 ***
## genderMale
                       -0.00687
                                            -0.098
                                                      0.922
                                   0.06975
## age_groupAdults
                       -0.06459
                                   0.07028
                                            -0.919
                                                       0.358
                                                       0.964
## age_groupElderly
                       -0.00532
                                   0.11638
                                            -0.046
## educationNo_college 0.62901
                                   0.13282
                                             4.736 2.77e-06 ***
## familiarityYes
                        0.06892
                                   0.08348
                                             0.826
                                                       0.409
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.7683 on 557 degrees of freedom
## Multiple R-squared: 0.04307,
                                    Adjusted R-squared: 0.03448
## F-statistic: 5.015 on 5 and 557 DF, p-value: 0.0001671
```

The regression model with 'q' as the outcome and gender, age_group, education, and familiarity as explanatory variables is significant, F(5, 557) = 5.015, p < 0.001. The model explains less than 4% of the variance in the misinformation index (outcome), with adjusted R squared at 0.034. Education is the only variable that significantly predicts the misinformation index.

Some visualizations

Let the plots speak!

require(gridExtra)

```
## Loading required package: gridExtra
##
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
##
       combine
p1 <- df %>% ggplot(aes(x=education, y=q))+
geom_boxplot()
p2 <- df %>% ggplot(aes(age_group, y=q))+geom_boxplot()
p3 <- ggplot(df, aes(gender, q,))+geom_boxplot()</pre>
p4 <- ggplot(df, aes(familiarity, q))+geom_boxplot()</pre>
grid.arrange(p1, p2, p3, p4, ncol =2)
   4 -
                                                     4 -
   3 -
                                                     3 -
 ♂2-
                                                  ♂2-
    1 -
                                                     1 -
   0 -
                                                     0 -
                               No_college
                                                            Youths
                                                                         Adults
                                                                                      Elderly
          college_educated
                      education
                                                                      age_group
   4 -
                                                     4 -
   3 -
                                                     3 -
 ♂2-
                                                  ♂2-
    1 -
                                                     1 -
   0 -
                                                     0 -
              Female
                                  Male
                                                                 No
                                                                                    Yes
                                                                       familiarity
                       gender
```