

Fake News Data - Stats and Correlations

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08/13/2021

```
data_code <- read_csv("fake_news_data_code.csv") %>%  
  select(-1)
```

Correlation with Dependent Variable

Dependent Variable = Shared Fake News (shared_fake_news_19)

P19 - Have you ever shared a political news story online that you thought at the time was made up? (Single Answer)

1 = Yes; 0 = No

PS: Statistically significant regarding each category to check if there are differences in observable characteristics between those who shared fake news. For example, is there a statistically significant difference between men than shared fake news and non-men that shared fake news? Analysis together with the correlation between each dummy variable with the dependent variable.

```
table_correlations <- data_code %>%  
  select(-P19, -shared_fake_news_19) %>%  
  select_if(is.numeric) %>%  
  lapply(., function(i) tidy(cor(i, data_code$shared_fake_news_19))) %>%  
  do.call(rbind, .) %>%  
  rownames_to_column("variable") %>%  
  rename("Correlation" = x)  
  
table_balance <- data_code %>%  
  select(-P19, -shared_fake_news_19) %>%  
  select(is.numeric) %>%  
  lapply(., function(i) tidy(t.test(i ~ data_code$shared_fake_news_19))) %>%  
  do.call(rbind, .) %>%  
  rownames_to_column("variable") %>%  
  rename(mean_diff = estimate, mean_control = estimate1,  
         mean_treatment = estimate2) %>%  
  mutate(stat_05 = if_else(p.value < 0.05, "Yes", "No")) %>%  
  select(variable, mean_diff, stat_05)
```

```

table_correlations <- table_correlations %>%
  left_join(table_balance, by = c("variable" = "variable")) %>%
  arrange(desc(Correlation))

table_correlations %>%
  kable(caption = "Balance Table - Observable Characteristics with Dependent Variable",
        digits = 3,
        align = "c")

```

Table 1: Balance Table - Observable Characteristics with Dependent Variable

| variable | Correlation | mean_diff | stat_05 |
|----------------------------------|-------------|-----------|---------|
| P21_Yes | 0.426 | -0.453 | Yes |
| share_news | 0.198 | -0.178 | Yes |
| pand5_increased_interest_science | 0.138 | -0.151 | Yes |
| trust_social_media | 0.136 | -0.101 | Yes |
| frequency_news | 0.133 | -0.148 | Yes |
| interest_news | 0.128 | -0.110 | Yes |
| pand1_fakenews_youtube | 0.126 | -0.146 | Yes |
| pand1_fakenews_facebook | 0.124 | -0.151 | Yes |
| pand1_fakenews_wpp | 0.116 | -0.138 | Yes |
| trust_magazine | 0.113 | -0.091 | Yes |
| trust_newspaper | 0.111 | -0.116 | Yes |
| trust_blogs | 0.104 | -0.054 | Yes |
| frequency_fake_news | 0.102 | -0.109 | Yes |
| trust_websites | 0.097 | -0.086 | Yes |
| impact_television | 0.096 | -0.104 | Yes |
| pand3_seek_science | 0.096 | -0.112 | Yes |
| pand1_fakenews_twitter | 0.092 | -0.090 | Yes |
| pand1_fakenews_instagram | 0.090 | -0.107 | Yes |
| impact_websites | 0.090 | -0.096 | Yes |
| interest_politics | 0.083 | -0.095 | Yes |
| same_ideology_news | 0.072 | -0.066 | Yes |
| source_alternative | 0.069 | -0.070 | Yes |
| vote2_electronic_best_option | 0.062 | -0.076 | Yes |
| impact_social_media | 0.052 | -0.052 | Yes |
| trust_agencies | 0.049 | -0.057 | Yes |
| class_c | 0.048 | -0.059 | Yes |
| pand3_trust_vaccine | 0.048 | -0.048 | Yes |
| impact_newspaper | 0.046 | -0.052 | Yes |
| religion_Evangelicals | 0.045 | -0.051 | No |
| region_Southeast | 0.045 | -0.054 | Yes |
| resp_gov | 0.044 | -0.046 | Yes |
| pand3_preventive_treat | 0.042 | -0.040 | No |
| pol_orientation_center | 0.042 | -0.030 | No |
| vote1_trust_ballot | 0.041 | -0.050 | No |
| trust_radio | 0.038 | -0.039 | No |
| pand1_fakenews_tiktok | 0.037 | -0.035 | No |
| trust_television | 0.037 | -0.038 | No |
| source_radio | 0.035 | -0.024 | No |
| resp_press | 0.034 | -0.034 | No |

| variable | Correlation mean_diffstat_05 | | |
|------------------------------|------------------------------|---------|----|
| impact2_facebook | 0.033 | -0.031 | No |
| pol_orientation_right | 0.032 | -0.033 | No |
| source_online_newspaper | 0.032 | -0.029 | No |
| age_full | 0.028 | -1.073 | No |
| source_podcasts | 0.028 | -0.013 | No |
| impact2_instagram | 0.027 | -0.030 | No |
| fact_checking | 0.026 | -0.031 | No |
| pol_orientation_left | 0.025 | -0.026 | No |
| resp_social_media | 0.025 | -0.027 | No |
| source_wpp | 0.024 | -0.021 | No |
| resp_politicians | 0.023 | -0.024 | No |
| source_family | 0.022 | -0.014 | No |
| pand3_masks | 0.020 | -0.016 | No |
| age_60_60 or more | 0.020 | -0.020 | No |
| age_60_45-59 age | 0.019 | -0.020 | No |
| impact2_wpp | 0.019 | -0.020 | No |
| impact_radio | 0.018 | -0.021 | No |
| source_printed_magazines | 0.015 | -0.004 | No |
| evaluation_Excellent/Good | 0.015 | -0.016 | No |
| evaluation_Bad/Terrible | 0.015 | -0.018 | No |
| impact_blogs | 0.015 | -0.017 | No |
| severity_fake_news | 0.014 | -0.011 | No |
| region_North | 0.013 | -0.009 | No |
| vote3_worried_hacker | 0.013 | -0.014 | No |
| education_high | 0.012 | -0.014 | No |
| impact2_twitter | 0.008 | -0.010 | No |
| gov_trust | 0.007 | -0.008 | No |
| income_low | 0.007 | -0.008 | No |
| religion_Other religion | 0.007 | -0.005 | No |
| religion_No religion | 0.006 | -0.005 | No |
| approves_gov | 0.006 | -0.006 | No |
| impact_cinema | 0.005 | -0.006 | No |
| resp_population | 0.004 | -0.005 | No |
| pand2_worse_perception_media | 0.001 | -0.001 | No |
| source_television | -0.001 | 0.002 | No |
| impact_magazines | -0.004 | 0.004 | No |
| impact2_tiktok | -0.004 | 0.005 | No |
| race_is_white | -0.006 | 0.007 | No |
| has_religion | -0.006 | 0.005 | No |
| idInterview | -0.007 | 176.266 | No |
| class_ab | -0.007 | 0.008 | No |
| source_online_magazine | -0.008 | 0.003 | No |
| age_60_25-34 age | -0.009 | 0.009 | No |
| age_60_16-24 age | -0.009 | 0.007 | No |
| P21_Unsure | -0.013 | 0.005 | No |
| sex_men | -0.014 | 0.017 | No |
| impact2_youtube | -0.015 | 0.017 | No |
| region_Center-West | -0.022 | 0.015 | No |
| region_Northeast | -0.022 | 0.024 | No |
| capital_metrop | -0.023 | 0.028 | No |
| age_60_35-44 age | -0.024 | 0.024 | No |
| evaluation_Regular | -0.024 | 0.025 | No |

| variable | Correlation | mean_diffstat_05 | |
|--|-------------|------------------|-----|
| region_South | -0.028 | 0.024 | No |
| vote3_worried_tech | -0.030 | 0.032 | No |
| evaluation_Unsure | -0.031 | 0.009 | No |
| vote3_worried_transparency | -0.035 | 0.036 | No |
| source_social_media | -0.038 | 0.042 | No |
| source_printed_newspaper | -0.038 | 0.017 | Yes |
| vote3_worried_tse | -0.040 | 0.043 | No |
| trust_traditional_press | -0.048 | 0.055 | Yes |
| class_de | -0.049 | 0.051 | Yes |
| religion_Catholic | -0.049 | 0.060 | Yes |
| vote3_worried_politics | -0.052 | 0.053 | Yes |
| pol_orientation_none | -0.058 | 0.068 | Yes |
| source_none | -0.063 | 0.018 | Yes |
| P21_No | -0.408 | 0.448 | Yes |
| reaction_fake_news_NA | -0.426 | 0.453 | Yes |
| reaction_fake_news_I didn't send a warning, but I also didn't share the same information anymore | NA | -0.011 | No |
| reaction_fake_news_I just sent a message warning that the information was not true | NA | -0.069 | No |
| reaction_fake_news_I kept sharing the information | NA | 0.027 | No |
| reaction_fake_news_I sent a message warning that the information was not true along with the correct information | NA | 0.043 | No |
| reaction_fake_news_Unsure | NA | 0.009 | No |

Multicollinearity Between Variables

Correlation matrix to identify multicollinearity. Excluded correlations between same variables, or dummies for the same questions (perfect collinearity addressed by dropping a value in the regression).

Highlighted variables with correlation higher than 0.3 in absolute value.

```
data_code_numeric <- data_code %>%
  select_if(is.numeric) %>%
  select(-idInterview, -reaction_fake_news_Unsure, -reaction_fake_news_NA)

matrix_correlations <- as.data.frame(round(cor(data_code_numeric), 2)) %>%
  rownames_to_column("variable_1") %>%
  pivot_longer(cols = is.numeric,
               names_to = "variable_2",
               values_to = "Correlation") %>%
  mutate(absolute_correlation = abs(Correlation)) %>%
  arrange(desc(absolute_correlation)) %>%
  mutate(question_1 = substr(variable_1, 1, 7),
         question_2 = substr(variable_2, 1, 7)) %>%
  separate(question_1, into = c("question_1", "left1"), sep = "_") %>%
  separate(question_2, into = c("question_2", "left2"), sep = "_") %>%
  mutate(same = if_else((variable_1 == variable_2) |
```

```

      (question_1 == question_2)), 1, 0)) %>%
filter(same == 0 & (absolute_correlation > 0.3)) %>%
select(-same, -left1, -left2, -question_1, -question_2)

matrix_correlations %>%
  kable(caption = "Correlation Between Variables (> 0.3 in absolute value)",
        align = "c")

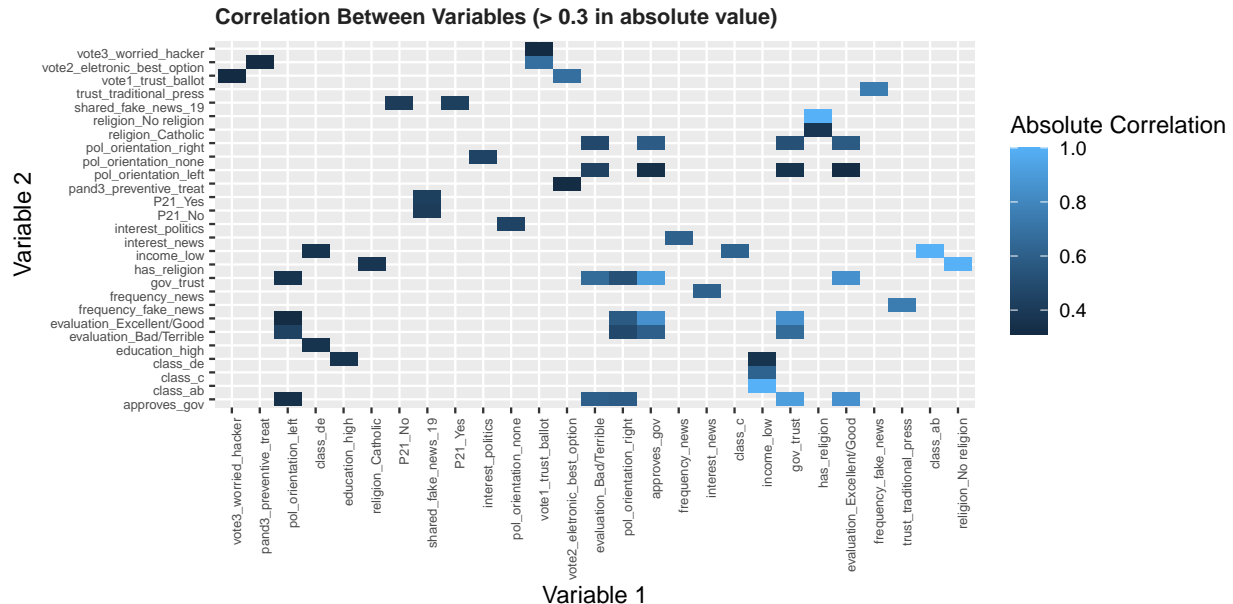
```

Table 2: Correlation Between Variables (> 0.3 in absolute value)

| variable_1 | variable_2 | Correlation | absolute_correlation |
|-----------------------------|-----------------------------|-------------|----------------------|
| religion_No religion | has_religion | -1.00 | 1.00 |
| income_low | class_ab | -1.00 | 1.00 |
| class_ab | income_low | -1.00 | 1.00 |
| has_religion | religion_No religion | -1.00 | 1.00 |
| gov_trust | approves_gov | 0.91 | 0.91 |
| approves_gov | gov_trust | 0.91 | 0.91 |
| gov_trust | evaluation_Excellent/Good | 0.85 | 0.85 |
| evaluation_Excellent/Good | gov_trust | 0.85 | 0.85 |
| evaluation_Excellent/Good | approves_gov | 0.85 | 0.85 |
| approves_gov | evaluation_Excellent/Good | 0.85 | 0.85 |
| trust_traditional_press | frequency_fake_news | -0.75 | 0.75 |
| frequency_fake_news | trust_traditional_press | -0.75 | 0.75 |
| vote1_trust_ballot | vote2_eletronic_best_option | 0.68 | 0.68 |
| vote2_eletronic_best_option | vote1_trust_ballot | 0.68 | 0.68 |
| gov_trust | evaluation_Bad/Terrible | -0.66 | 0.66 |
| evaluation_Bad/Terrible | gov_trust | -0.66 | 0.66 |
| income_low | class_c | 0.62 | 0.62 |
| class_c | income_low | 0.62 | 0.62 |
| interest_news | frequency_news | 0.61 | 0.61 |
| frequency_news | interest_news | 0.61 | 0.61 |
| evaluation_Bad/Terrible | approves_gov | -0.60 | 0.60 |
| approves_gov | evaluation_Bad/Terrible | -0.60 | 0.60 |
| approves_gov | pol_orientation_right | 0.58 | 0.58 |
| pol_orientation_right | approves_gov | 0.58 | 0.58 |
| evaluation_Excellent/Good | pol_orientation_right | 0.57 | 0.57 |
| pol_orientation_right | evaluation_Excellent/Good | 0.57 | 0.57 |
| gov_trust | pol_orientation_right | 0.52 | 0.52 |
| pol_orientation_right | gov_trust | 0.52 | 0.52 |
| evaluation_Bad/Terrible | pol_orientation_right | -0.48 | 0.48 |
| pol_orientation_right | evaluation_Bad/Terrible | -0.48 | 0.48 |
| interest_politics | pol_orientation_none | -0.45 | 0.45 |
| pol_orientation_none | interest_politics | -0.45 | 0.45 |
| evaluation_Bad/Terrible | pol_orientation_left | 0.44 | 0.44 |
| pol_orientation_left | evaluation_Bad/Terrible | 0.44 | 0.44 |
| shared_fake_news_19 | P21_Yes | 0.43 | 0.43 |
| P21_Yes | shared_fake_news_19 | 0.43 | 0.43 |
| shared_fake_news_19 | P21_No | -0.41 | 0.41 |
| P21_No | shared_fake_news_19 | -0.41 | 0.41 |
| religion_Catholic | has_religion | 0.37 | 0.37 |
| has_religion | religion_Catholic | 0.37 | 0.37 |
| gov_trust | pol_orientation_left | -0.36 | 0.36 |

| variable_1 | variable_2 | Correlation | absolute_correlation |
|-----------------------------|-----------------------------|-------------|----------------------|
| pol_orientation_left | gov_trust | -0.36 | 0.36 |
| education_high | class_de | -0.36 | 0.36 |
| income_low | class_de | 0.36 | 0.36 |
| class_de | education_high | -0.36 | 0.36 |
| class_de | income_low | 0.36 | 0.36 |
| approves_gov | pol_orientation_left | -0.34 | 0.34 |
| pol_orientation_left | approves_gov | -0.34 | 0.34 |
| pand3_preventive_treat | vote2_eletronic_best_option | -0.32 | 0.32 |
| vote2_eletronic_best_option | pand3_preventive_treat | -0.32 | 0.32 |
| evaluation_Excellent/Good | pol_orientation_left | -0.32 | 0.32 |
| pol_orientation_left | evaluation_Excellent/Good | -0.32 | 0.32 |
| vote1_trust_ballot | vote3_worried_hacker | -0.31 | 0.31 |
| vote3_worried_hacker | vote1_trust_ballot | -0.31 | 0.31 |

```
matrix_correlations %>%
  ggplot(aes(x = fct_reorder(variable_1, absolute_correlation),
    y = variable_2, fill = absolute_correlation)) +
  geom_tile() +
  theme(axis.text.x = element_text(angle = 90, vjust = 1, hjust = 1, size = 6),
    axis.text.y = element_text(vjust = 1, hjust = 1, size = 6),
    plot.title = element_text(color = "grey13", size = 10, face = "bold")) +
  labs(x = "Variable 1", y = "Variable 2", fill = "Absolute Correlation",
    title = "Correlation Between Variables (> 0.3 in absolute value)")
```



Regressions - All categories

Dependent variable: shared_fake_news_19

Model 1 - Only demographics

```
model_19_1 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +  
  education_high + class_ab + class_c + has_religion,  
  family = binomial(link = 'logit'),  
  data = data_code)  
  
#Left out: No religion, women
```

Model 2 - Demographics + Region and City

```
model_19_2 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +  
  education_high + class_ab + class_c + has_religion +  
  region_North + region_Northeast +  
  region_Southeast + region_South + capital_metrop,  
  family = binomial(link = 'logit'),  
  data = data_code)
```

Model 3 - Demographics + Region and City + Political Orientation

```
model_19_3 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +  
  education_high + class_ab + class_c + has_religion +  
  region_North + region_Northeast +  
  region_Southeast + region_South + capital_metrop +  
  pol_orientation_right + pol_orientation_center +  
  pol_orientation_left,  
  family = binomial(link = 'logit'),  
  data = data_code)  
  
#Left out: religion_No religion + region_Center-West + pol_orientation_none
```

Model 4 - Demographics + Region and City + Political Orientation + Government Evaluation

```
model_19_4 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +  
  education_high + class_ab + class_c + has_religion +  
  region_North + region_Northeast +  
  region_Southeast + region_South + capital_metrop +  
  pol_orientation_right + pol_orientation_center +  
  pol_orientation_left + approves_gov,  
  family = binomial(link = 'logit'),  
  data = data_code)  
  
#Left out: religion_No religion + region_Center-West + pol_orientation_none
```

Model 5 - Demographics + Region and City + Political Orientation + Government Evaluation + Answers Fake News

```

model_19_5 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +
  education_high + class_ab + class_c + has_religion +
  region_North + region_Northeast +
  region_Southeast + region_South + capital_metrop +
  pol_orientation_right + pol_orientation_center +
  pol_orientation_left + approves_gov +
  frequency_fake_news + resp_population + resp_gov +
  resp_politicians + resp_press + resp_social_media +
  severity_fake_news + fact_checking,
  family = binomial(link = 'logit'),
  data = data_code)

```

Model 6 - Demographics + Region and City + Political Orientation + Government Evaluation + Pandemic

attention increased interest in science

```

model_19_6 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +
  education_high + class_ab + class_c + has_religion +
  region_North + region_Northeast +
  region_Southeast + region_South + capital_metrop +
  pol_orientation_right + pol_orientation_center +
  pol_orientation_left + approves_gov +
  pand2_worse_perception_media + pand3_trust_vaccine +
  pand3_seek_science + pand3_preventive_treat + pand3_masks +
  pand5_increased_interest_science,
  family = binomial(link = 'logit'),
  data = data_code)

```

Model 7 - Demographics + Region and City + Political Orientation + Government Evaluation + Vote

```

model_19_7 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +
  education_high + class_ab + class_c + has_religion +
  region_North + region_Northeast +
  region_Southeast + region_South + capital_metrop +
  pol_orientation_right + pol_orientation_center +
  pol_orientation_left + approves_gov +
  vote1_trust_ballot + vote2_electronic_best_option +
  vote3_worried_hacker + vote3_worried_politics +
  vote3_worried_transparency + vote3_worried_tech +
  vote3_worried_tse,
  family = binomial(link = 'logit'),
  data = data_code)

```

#Left out: religion_Other religion + pol_orientation_none

Model 8 - All


```

model_19_8 <- glm(shared_fake_news_19 ~ sex_men + age_full + race_is_white +
  education_high + class_ab + class_c + has_religion +
  region_North + region_Northeast +
  region_Southeast + region_South + capital_metrop +
  pol_orientation_right + pol_orientation_center +
  pol_orientation_left + approves_gov +
  frequency_fake_news + resp_population + resp_gov +
  resp_politicians + resp_press + resp_social_media +
  severity_fake_news + fact_checking +
  pand2_worse_perception_media + pand3_trust_vaccine +
  pand3_seek_science + pand3_preventive_treat + pand3_masks +
  pand5_increased_interest_science + vote1_trust_ballot +
  vote2_electronic_best_option + vote3_worried_hacker +
  vote3_worried_politics + vote3_worried_transparency +
  vote3_worried_tech + vote3_worried_tse,
family = binomial(link = 'logit'),
data = data_code)

```

Models

Table 3: Logit Models Comparison - Up to Government Evaluation

| | <i>Dependent variable:</i> | | | |
|------------------------|----------------------------|----------------------|----------------------|----------------------|
| | shared_fake_news_19 | | | |
| sex_men | -0.070 (0.112) | -0.071 (0.112) | -0.155 (0.116) | -0.153 (0.117) |
| age_full | 0.005 (0.004) | 0.005 (0.004) | 0.005 (0.004) | 0.005 (0.004) |
| race_is_white | -0.067 (0.116) | -0.068 (0.116) | -0.075 (0.117) | -0.075 (0.117) |
| education_high | 0.025 (0.126) | 0.018 (0.126) | 0.029 (0.126) | 0.029 (0.126) |
| class_ab | 0.207 (0.175) | 0.228 (0.176) | 0.211 (0.177) | 0.211 (0.177) |
| class_c | 0.362** (0.154) | 0.370** (0.154) | 0.377** (0.155) | 0.377** (0.155) |
| has_religion | -0.077 (0.172) | -0.087 (0.173) | -0.089 (0.174) | -0.089 (0.174) |
| region_North | | 0.318 (0.287) | 0.348 (0.289) | 0.346 (0.289) |
| region_Northeast | | 0.086 (0.238) | 0.112 (0.239) | 0.109 (0.240) |
| region_Southeast | | 0.314 (0.225) | 0.241 (0.228) | 0.239 (0.228) |
| region_South | | 0.018 (0.259) | -0.004 (0.260) | -0.004 (0.260) |
| capital_metrop | | -0.152 (0.114) | -0.164 (0.115) | -0.163 (0.115) |
| pol_orientation_right | | | 0.393*** (0.152) | 0.409** (0.174) |
| pol_orientation_center | | | 0.522*** (0.195) | 0.520*** (0.195) |
| pol_orientation_left | | | 0.311** (0.148) | 0.305** (0.151) |
| approves_gov | | | | -0.030 (0.160) |
| Constant | -1.653*** (0.257) | -1.779*** (0.328) | -1.930*** (0.335) | -1.925*** (0.336) |
| Observations | 1,934 | 1,934 | 1,934 | 1,934 |
| Log Likelihood | -995.995 | -992.458 | -986.832 | -986.815 |
| Akaike Inf. Crit. | 2,007.991 | 2,010.916 | 2,005.664 | 2,007.629 |

Note:

*p<0.1; **p<0.05; ***p<0.01

Table 4: Logit Models Comparison - Answers Fake News

| | <i>Dependent variable:</i> | | | |
|------------------------|----------------------------|----------------------|----------------------|----------------------|
| | shared_fake_news_19 | | | |
| sex_men | -0.070 (0.112) | -0.071 (0.112) | -0.155 (0.116) | -0.149 (0.118) |
| age_full | 0.005 (0.004) | 0.005 (0.004) | 0.005 (0.004) | 0.006 (0.004) |
| race_is_white | -0.067 (0.116) | -0.068 (0.116) | -0.075 (0.117) | -0.062 (0.118) |
| education_high | 0.025 (0.126) | 0.018 (0.126) | 0.029 (0.126) | 0.016 (0.127) |
| class_ab | 0.207 (0.175) | 0.228 (0.176) | 0.211 (0.177) | 0.148 (0.179) |
| class_c | 0.362** (0.154) | 0.370** (0.154) | 0.377** (0.155) | 0.320** (0.157) |
| has_religion | -0.077 (0.172) | -0.087 (0.173) | -0.089 (0.174) | -0.067 (0.176) |
| region_North | | 0.318 (0.287) | 0.348 (0.289) | 0.294 (0.293) |
| region_Northeast | | 0.086 (0.238) | 0.112 (0.239) | 0.029 (0.243) |
| region_Southeast | | 0.314 (0.225) | 0.241 (0.228) | 0.136 (0.231) |
| region_South | | 0.018 (0.259) | -0.004 (0.260) | -0.080 (0.264) |
| capital_metrop | | -0.152 (0.114) | -0.164 (0.115) | -0.180 (0.116) |
| pol_orientation_right | | | 0.393*** (0.152) | 0.379** (0.175) |
| pol_orientation_center | | | 0.522*** (0.195) | 0.491** (0.197) |
| pol_orientation_left | | | 0.311** (0.148) | 0.271* (0.152) |
| approves_gov | | | | -0.016 (0.161) |
| frequency_fake_news | | | | 0.599*** (0.147) |
| resp_population | | | | -0.240 (0.178) |
| resp_gov | | | | 0.431* (0.232) |
| resp_politicians | | | | -0.175 (0.232) |
| resp_press | | | | 0.143 (0.198) |
| resp_social_media | | | | -0.002 (0.181) |
| severity_fake_news | | | | 0.014 (0.189) |
| fact_checking | | | | 0.077 (0.117) |
| Constant | -1.653*** (0.257) | -1.779*** (0.328) | -1.930*** (0.335) | -2.465*** (0.391) |
| Observations | 1,934 | 1,934 | 1,934 | 1,934 |
| Log Likelihood | -995.995 | -992.458 | -986.832 | -974.489 |
| Akaike Inf. Crit. | 2,007.991 | 2,010.916 | 2,005.664 | 1,998.979 |

Note:

*p<0.1; **p<0.05; ***p<0.01

Table 5: Logit Models Comparison - Pandemic

| | <i>Dependent variable:</i> | | | |
|----------------------------------|----------------------------|----------------------|----------------------|----------------------|
| | shared_fake_news_19 | | | |
| sex_men | -0.070 (0.112) | -0.071 (0.112) | -0.155 (0.116) | -0.119 (0.119) |
| age_full | 0.005 (0.004) | 0.005 (0.004) | 0.005 (0.004) | 0.006* (0.004) |
| race_is_white | -0.067 (0.116) | -0.068 (0.116) | -0.075 (0.117) | -0.121 (0.119) |
| education_high | 0.025 (0.126) | 0.018 (0.126) | 0.029 (0.126) | 0.050 (0.128) |
| class_ab | 0.207 (0.175) | 0.228 (0.176) | 0.211 (0.177) | 0.161 (0.181) |
| class_c | 0.362** (0.154) | 0.370** (0.154) | 0.377** (0.155) | 0.330** (0.158) |
| has_religion | -0.077 (0.172) | -0.087 (0.173) | -0.089 (0.174) | -0.027 (0.177) |
| region_North | | 0.318 (0.287) | 0.348 (0.289) | 0.258 (0.294) |
| region_Northeast | | 0.086 (0.238) | 0.112 (0.239) | 0.060 (0.244) |
| region_Southeast | | 0.314 (0.225) | 0.241 (0.228) | 0.113 (0.232) |
| region_South | | 0.018 (0.259) | -0.004 (0.260) | -0.024 (0.265) |
| capital_metrop | | -0.152 (0.114) | -0.164 (0.115) | -0.174 (0.117) |
| pol_orientation_right | | | 0.393*** (0.152) | 0.366** (0.177) |
| pol_orientation_center | | | 0.522*** (0.195) | 0.490** (0.198) |
| pol_orientation_left | | | 0.311** (0.148) | 0.291* (0.153) |
| approves_gov | | | | -0.060 (0.164) |
| pand2_worse_perception_media | | | | -0.090 (0.127) |
| pand3_trust_vaccine | | | | 0.227 (0.144) |
| pand3_seek_science | | | | 0.327** (0.132) |
| pand3_preventive_treat | | | | 0.227 (0.156) |
| pand3_masks | | | | 0.140 (0.176) |
| pand5_increased_interest_science | | | | 0.837*** (0.152) |
| Constant | -1.653*** (0.257) | -1.779*** (0.328) | -1.930*** (0.335) | -2.837*** (0.373) |
| Observations | 1,934 | 1,934 | 1,934 | 1,934 |
| Log Likelihood | -995.995 | -992.458 | -986.832 | -960.397 |
| Akaike Inf. Crit. | 2,007.991 | 2,010.916 | 2,005.664 | 1,966.794 |

Note:

*p<0.1; **p<0.05; ***p<0.01

Table 6: Logit Models Comparison - Electronic Vote

| | <i>Dependent variable:</i> | | | |
|------------------------------|----------------------------|----------------------|----------------------|----------------------|
| | shared_fake_news_19 | | | |
| sex_men | -0.070 (0.112) | -0.071 (0.112) | -0.155 (0.116) | -0.151 (0.117) |
| age_full | 0.005 (0.004) | 0.005 (0.004) | 0.005 (0.004) | 0.006 (0.004) |
| race_is_white | -0.067 (0.116) | -0.068 (0.116) | -0.075 (0.117) | -0.085 (0.119) |
| education_high | 0.025 (0.126) | 0.018 (0.126) | 0.029 (0.126) | 0.013 (0.128) |
| class_ab | 0.207 (0.175) | 0.228 (0.176) | 0.211 (0.177) | 0.209 (0.180) |
| class_c | 0.362** (0.154) | 0.370** (0.154) | 0.377** (0.155) | 0.374** (0.157) |
| has_religion | -0.077 (0.172) | -0.087 (0.173) | -0.089 (0.174) | -0.111 (0.175) |
| region_North | | 0.318 (0.287) | 0.348 (0.289) | 0.357 (0.291) |
| region_Northeast | | 0.086 (0.238) | 0.112 (0.239) | 0.098 (0.241) |
| region_Southeast | | 0.314 (0.225) | 0.241 (0.228) | 0.226 (0.229) |
| region_South | | 0.018 (0.259) | -0.004 (0.260) | -0.005 (0.262) |
| capital_metrop | | -0.152 (0.114) | -0.164 (0.115) | -0.162 (0.116) |
| pol_orientation_right | | | 0.393*** (0.152) | 0.428** (0.175) |
| pol_orientation_center | | | 0.522*** (0.195) | 0.557*** (0.197) |
| pol_orientation_left | | | 0.311** (0.148) | 0.280* (0.153) |
| approves_gov | | | | 0.022 (0.161) |
| vote1_trust_ballot | | | | 0.0003 (0.157) |
| vote2_electronic_best_option | | | | 0.305* (0.157) |
| vote3_worried_hacker | | | | 0.696*** (0.202) |
| vote3_worried_politics | | | | -0.695*** (0.252) |
| vote3_worried_transparency | | | | 0.045 (0.236) |
| vote3_worried_tech | | | | -0.003 (0.191) |
| vote3_worried_tse | | | | -0.176 (0.179) |
| Constant | -1.653*** (0.257) | -1.779*** (0.328) | -1.930*** (0.335) | -1.955*** (0.370) |
| Observations | 1,934 | 1,934 | 1,934 | 1,934 |
| Log Likelihood | -995.995 | -992.458 | -986.832 | -974.744 |
| Akaike Inf. Crit. | 2,007.991 | 2,010.916 | 2,005.664 | 1,997.487 |

Note:

*p<0.1; **p<0.05; ***p<0.01

Table 7: Logit Models Comparison - All Variables

| | <i>Dependent variable:</i> | | | |
|----------------------------------|----------------------------|----------------------|----------------------|----------------------|
| | shared_fake_news_19 | | | |
| sex_men | -0.149 (0.118) | -0.119 (0.119) | -0.151 (0.117) | -0.106 (0.121) |
| age_full | 0.006 (0.004) | 0.006* (0.004) | 0.006 (0.004) | 0.006* (0.004) |
| race_is_white | -0.062 (0.118) | -0.121 (0.119) | -0.085 (0.119) | -0.127 (0.122) |
| education_high | 0.016 (0.127) | 0.050 (0.128) | 0.013 (0.128) | 0.007 (0.130) |
| class_ab | 0.148 (0.179) | 0.161 (0.181) | 0.209 (0.180) | 0.167 (0.186) |
| class_c | 0.320** (0.157) | 0.330** (0.158) | 0.374** (0.157) | 0.337** (0.161) |
| has_religion | -0.067 (0.176) | -0.027 (0.177) | -0.111 (0.175) | -0.038 (0.180) |
| region_North | 0.294 (0.293) | 0.258 (0.294) | 0.357 (0.291) | 0.282 (0.300) |
| region_Northeast | 0.029 (0.243) | 0.060 (0.244) | 0.098 (0.241) | 0.026 (0.248) |
| region_Southeast | 0.136 (0.231) | 0.113 (0.232) | 0.226 (0.229) | 0.053 (0.236) |
| region_South | -0.080 (0.264) | -0.024 (0.265) | -0.005 (0.262) | -0.061 (0.270) |
| capital_metrop | -0.180 (0.116) | -0.174 (0.117) | -0.162 (0.116) | -0.191 (0.118) |
| pol_orientation_right | 0.379** (0.175) | 0.366** (0.177) | 0.428** (0.175) | 0.349* (0.180) |
| pol_orientation_center | 0.491** (0.197) | 0.490** (0.198) | 0.557*** (0.197) | 0.517** (0.201) |
| pol_orientation_left | 0.271* (0.152) | 0.291* (0.153) | 0.280* (0.153) | 0.247 (0.156) |
| approves_gov | -0.016 (0.161) | -0.060 (0.164) | 0.022 (0.161) | -0.021 (0.166) |
| frequency_fake_news | 0.599*** (0.147) | | | 0.469*** (0.156) |
| resp_population | -0.240 (0.178) | | | -0.299 (0.183) |
| resp_gov | 0.431* (0.232) | | | 0.371 (0.233) |
| resp_politicians | -0.175 (0.232) | | | -0.042 (0.235) |
| resp_press | 0.143 (0.198) | | | 0.141 (0.203) |
| resp_social_media | -0.002 (0.181) | | | 0.020 (0.185) |
| severity_fake_news | 0.014 (0.189) | | | -0.128 (0.195) |
| fact_checking | 0.077 (0.117) | | | 0.023 (0.121) |
| pand2_worse_perception_media | | -0.090 (0.127) | | -0.015 (0.136) |
| pand3_trust_vaccine | | 0.227 (0.144) | | 0.272* (0.148) |
| pand3_seek_science | | 0.327** (0.132) | | 0.285** (0.137) |
| pand3_preventive_treat | | 0.227 (0.156) | | 0.290* (0.164) |
| pand3_masks | | 0.140 (0.176) | | 0.230 (0.181) |
| pand5_increased_interest_science | | 0.837*** (0.152) | | 0.745*** (0.163) |
| vote1_trust_ballot | | | 0.0003 (0.157) | -0.100 (0.163) |
| vote2_electronic_best_option | | | 0.305* (0.157) | 0.245 (0.169) |
| vote3_worried_hacker | | | 0.696*** (0.202) | 0.709*** (0.210) |
| vote3_worried_politics | | | -0.695*** (0.252) | 0.851*** (0.261) |
| vote3_worried_transparency | | | 0.045 (0.236) | -0.014 (0.238) |
| vote3_worried_tech | | | -0.003 (0.191) | -0.038 (0.190) |
| vote3_worried_tse | | | -0.176 (0.179) | -0.163 (0.182) |
| Constant | -2.465*** (0.391) | -2.837*** (0.373) | -1.955*** (0.370) | -2.953*** (0.442) |
| Observations | 1,934 | 1,934 | 1,934 | 1,934 |
| Log Likelihood | -974.489 | -960.397 | -974.744 | -940.721 |
| Akaike Inf. Crit. | 1,998.979 | 1,966.794 | 1,997.487 | 1,957.442 |

Note:

*p<0.1; **p<0.05; ***p<0.01

Variance Inflation Factor (VIF)

"For a given predictor (p), multicollinearity can be assessed by computing a score called the variance inflation factor (or VIF), which measures how much the variance of a regression coefficient is inflated due to multicollinearity in the model.

The smallest possible value of VIF is one (absence of multicollinearity). As a rule of thumb, a VIF value that exceeds 5 or 10 indicates a problematic amount of collinearity (James et al. 2014)."

```
model_1 <- as.data.frame(car::vif(model_19_1)) %>%
  rownames_to_column("variables")

model_2 <- as.data.frame(car::vif(model_19_2)) %>%
  rownames_to_column("variables")

model_3 <- as.data.frame(car::vif(model_19_3)) %>%
  rownames_to_column("variables")

model_4 <- as.data.frame(car::vif(model_19_4)) %>%
  rownames_to_column("variables")

model_5 <- as.data.frame(car::vif(model_19_5)) %>%
  rownames_to_column("variables")

model_6 <- as.data.frame(car::vif(model_19_6)) %>%
  rownames_to_column("variables")

model_7 <- as.data.frame(car::vif(model_19_7)) %>%
  rownames_to_column("variables")

model_8 <- as.data.frame(car::vif(model_19_8)) %>%
  rownames_to_column("variables")

vif_test <- model_8 %>%
  left_join(model_1, by = c("variables" = "variables")) %>%
  left_join(model_2, by = c("variables" = "variables")) %>%
  left_join(model_3, by = c("variables" = "variables")) %>%
  left_join(model_4, by = c("variables" = "variables")) %>%
  left_join(model_5, by = c("variables" = "variables")) %>%
  left_join(model_6, by = c("variables" = "variables")) %>%
  left_join(model_7, by = c("variables" = "variables"))

names(vif_test) <- c("variables", "model_8", "model_1", "model_2", "model_3",
  "model_4", "model_5", "model_6", "model_7")

vif_test <- relocate(vif_test, -model_8)

vif_test %>%
  kable(caption = "Variance Inflation Factor (VIF) per variable and model",
    align = "c")
```

Table 8: Variance Inflation Factor (VIF) per variable and model

| variables | model_1 | model_2 | model_3 | model_4 | model_5 | model_6 | model_7 | model_8 |
|----------------------------------|----------|----------|----------|----------|----------|----------|----------|----------|
| sex_men | 1.004308 | 1.003969 | 1.074148 | 1.077354 | 1.088623 | 1.085214 | 1.078813 | 1.099887 |
| age_full | 1.051315 | 1.061471 | 1.085001 | 1.091882 | 1.100472 | 1.096215 | 1.101038 | 1.111311 |
| race_is_white | 1.062172 | 1.063498 | 1.067563 | 1.067894 | 1.070869 | 1.077058 | 1.082107 | 1.097782 |
| education_high | 1.222273 | 1.218394 | 1.222982 | 1.223150 | 1.228920 | 1.226336 | 1.235793 | 1.239305 |
| class_ab | 2.100814 | 2.106335 | 2.108863 | 2.109421 | 2.147034 | 2.162454 | 2.152418 | 2.216554 |
| class_c | 1.910303 | 1.912693 | 1.910794 | 1.910965 | 1.936157 | 1.937684 | 1.948222 | 1.977373 |
| has_religion | 1.014512 | 1.015206 | 1.021483 | 1.021483 | 1.029796 | 1.031889 | 1.026527 | 1.041165 |
| region_North | NA | 1.970819 | 1.971841 | 1.974584 | 2.011260 | 1.990899 | 1.968430 | 2.021453 |
| region_Northeast | NA | 3.415338 | 3.441923 | 3.453177 | 3.497177 | 3.487590 | 3.454540 | 3.526172 |
| region_Southeast | NA | 4.044865 | 4.112833 | 4.118946 | 4.187723 | 4.164625 | 4.117633 | 4.210407 |
| region_South | NA | 2.529021 | 2.544072 | 2.544192 | 2.591545 | 2.563836 | 2.539456 | 2.602606 |
| capital_metrop | NA | 1.031059 | 1.032414 | 1.032672 | 1.037414 | 1.039627 | 1.034414 | 1.047510 |
| pol_orientation_right | NA | NA | 1.326416 | 1.742652 | 1.751743 | 1.752502 | 1.746921 | 1.773481 |
| pol_orientation_center | NA | NA | 1.208341 | 1.209901 | 1.216768 | 1.213186 | 1.216734 | 1.228978 |
| pol_orientation_left | NA | NA | 1.282995 | 1.341287 | 1.346836 | 1.344471 | 1.358990 | 1.369474 |
| approves_gov | NA | NA | NA | 1.650830 | 1.654909 | 1.687137 | 1.670208 | 1.709206 |
| frequency_fake_news | NA | NA | NA | NA | 1.036118 | NA | NA | 1.123227 |
| resp_population | NA | NA | NA | NA | 1.826496 | NA | NA | 1.843091 |
| resp_gov | NA | NA | NA | NA | 2.787927 | NA | NA | 2.717867 |
| resp_politicians | NA | NA | NA | NA | 3.084394 | NA | NA | 3.053164 |
| resp_press | NA | NA | NA | NA | 1.939519 | NA | NA | 1.967762 |
| resp_social_media | NA | NA | NA | NA | 1.880829 | NA | NA | 1.898612 |
| severity_fake_news | NA | NA | NA | NA | 1.093502 | NA | NA | 1.115265 |
| fact_checking | NA | NA | NA | NA | 1.066909 | NA | NA | 1.090067 |
| pand2_worse_perception_med | NA | NA | NA | NA | NA | 1.069931 | NA | 1.197143 |
| pand3_trust_vaccine | NA | NA | NA | NA | NA | 1.170128 | NA | 1.220639 |
| pand3_seek_science | NA | NA | NA | NA | NA | 1.099718 | NA | 1.159750 |
| pand3_preventive_treat | NA | NA | NA | NA | NA | 1.239603 | NA | 1.347526 |
| pand3_masks | NA | NA | NA | NA | NA | 1.143633 | NA | 1.182261 |
| pand5_increased_interest_science | NA | NA | NA | NA | NA | 1.067473 | NA | 1.188706 |
| vote1_trust_ballot | NA | NA | NA | NA | NA | NA | 1.930110 | 2.012207 |
| vote2_electronic_best_option | NA | NA | NA | NA | NA | NA | 1.862473 | 2.081942 |
| vote3_worried_hacker | NA | NA | NA | NA | NA | NA | 2.625497 | 2.731106 |
| vote3_worried_politics | NA | NA | NA | NA | NA | NA | 3.826703 | 3.948837 |
| vote3_worried_transparency | NA | NA | NA | NA | NA | NA | 3.380729 | 3.316015 |
| vote3_worried_tech | NA | NA | NA | NA | NA | NA | 2.281381 | 2.188962 |
| vote3_worried_tse | NA | NA | NA | NA | NA | NA | 2.104643 | 2.081119 |