

# COVID-19 Survey - Data Cleaning

December 3, 2020

## Import data

```
ds <- readxl::read_xlsx(  
  "data/raw/Covid-19+Survey+--+baseline+--+subset_April+20%2C+2020_14.57.xlsx",  
  skip = 2, col_names = FALSE)  
  
# take trust pres from .csv format  
pres <- read.csv("data/raw/Covid-19+Survey+--+baseline+--+subset_April+23,+2020_14.09_num.csv")[-c(1:2),]
```

## Notes

- Not all respondents finished the survey, but we include incomplete surveys

```
table(ds$loc_country, ds$Finished)
```

```
##  
##      0      1  
##  1  43  604  
##  2 111 1480  
##  3   59  506  
##  4    0   19
```

## Consent

```
dat <- ds %>% mutate(  
  consent = coalesce(consent_general,  
                     consent_NG,  
                     consent_KY,  
                     consent_UG))  
  
#Exclude non-consent  
#REVIEW: leave incomplete surveys (Finished == 0)  
dat <- dat %>% filter(consent == 1)
```

## Location

```
dat %<>% mutate(  
  #nigeria - zone, uganda - region  
  loc_admin1 = coalesce(loc_zone_NG, loc_reg_UG),  
  #nigeria - state, kenya - county, uganda - district  
  loc_admin2 = coalesce(loc_state_nc_ng, loc_state_ne_ng, loc_state_nw_ng,  
                        loc_state_se_ng, loc_state_ss_ng, loc_state_sw_ng,
```

```

loc_county_KY,
loc_dist_cent_ug, loc_dist_west_ug,
loc_dist_east_ug, loc_dist_north_ug),
# uganda - division, nigeria - Lagos LGA
loc_admin3 = coalesce(loc_kla_div, loc_LGA_lagos),
# uganda - parish/subcounty
loc_admin4 = coalesce(loc_kla_cent, loc_kla_kawempe,
                      loc_kla_rubaga, loc_kla_makindye,
                      loc_kla_nakawa, loc_wakiso_sc,
                      loc_mukono_sc,
                      loc_subc_ky))

# Location fixed effect
dat$loc_fe = sapply(1:nrow(dat), function(i)
  paste0(setdiff(as.character(dat[i,15:40]), c("NA", "", NA)), collapse = "_"))

```

## Trust

```

dat %<>% mutate(trust_cov_moh = ifelse(!is.na(trust_cov_moh_ng),
                                       trust_cov_moh_ng, trust_cov_moh))

dat %<>%
  mutate(trust_gov_ng = (trust_cov_moh + trust_cov_hwork)/2,
         trust_gov = (trust_cov_moh + trust_cov_hwork + trust_cov_pres)/3) %>%
  group_by(country) %>%
  mutate(trust_gov = trust_gov - mean(trust_gov, na.rm = TRUE),
         trust_gov_ng = trust_gov_ng - mean(trust_gov_ng, na.rm = TRUE)) %>%
  ungroup()

dat$trust_gov <- ifelse(dat$country == "Nigeria", dat$trust_gov_ng, dat$trust_gov)

```

## Multiple Choice Questions

```

vars_mchoice <- c("fact_trueforyou", "fact_truecovid",
                  "fact_reduce_spread", "fact_response",
                  "info2", "remit")

for(i in vars_mchoice){
  dat <- cbind(dat, expand_mchoice(i))
}

```

## List Experiment

```

dat %<>% mutate(
  le_control = coalesce(le_kenya_control, le_nigeria_control,
                       le_uganda_control),
  le_treat = coalesce(le_kenya_treat, le_nigeria_treat,
                     le_uganda_treat),
  le_count = case_when(!is.na(le_control) ~ le_control,
                       !is.na(le_treat) ~ le_treat),

```

```
le_condition = case_when(!is.na(le_control) ~ 0,
                          !is.na(le_treat) ~ 1))
```

## Vignette Experiment

```
dat %<>% mutate(
  hypo_condition = case_when(!is.na(hypo_norm0) ~ "C",
                             !is.na(hypo_norm1) ~ "T1",
                             !is.na(hypo_norm2) ~ "T2"),
  hypo_answer = case_when(!is.na(hypo_norm0) ~ hypo_norm0,
                          !is.na(hypo_norm1) ~ hypo_norm1,
                          !is.na(hypo_norm2) ~ hypo_norm2))
```

## Behavioral Questions

```
#REVIEW: Validate letter content - some 15 people wrote "None"
# grep("^No", dat$behav_letter, value = TRUE, ignore.case = TRUE)
NAletter <- grepl("No", dat$behav_letter,
                 ignore.case = TRUE) & nchar(dat$behav_letter) < 15

dat <- dat %>% mutate(
  #recode behav_write = 1=yes, 0=no
  behav_write = case_when(behav_write == 4 ~ 1,
                          behav_write == 5 ~ 0),
  #new var if behav_letter content does not include "None"-type messages
  behav_wrote = case_when(!behav_letter %in% NAletter & !is.na(behav_letter) ~ 1,
                          NAletter | behav_write == 0 ~ 0))

dat <- dat %>% mutate(att_lock_yes = 1*(att_lock > 0)) %>%
  group_by(country) %>%
  mutate(att_lock_pct = mean(att_lock_yes, na.rm = TRUE)) %>%
  ungroup() %>%
  mutate(att_lock_correct = round(att_lock_pct, 1),
         att_lock_gap = (att_lock_guess/10)-att_lock_correct,
         att_lock_gap_abs = abs(att_lock_guess/10-att_lock_correct))
```

## Demographic

```
dat <- dat %>% mutate(
  female = dem_sex,

  #create combined country_ethnicity var
  dem_eth = coalesce(dem_eth_ke, dem_eth_ng, dem_eth_ug),
  dem_eth = ifelse(!is.na(dem_eth),
                  paste(loc_country, dem_eth, sep = "_"),
                  dem_eth),

  # code urban as dummy
  loc_urbrur = case_when(loc_urbrur == 2 ~ 0,
                        loc_urbrur == 1 ~ 1),
```

```

#code binary var for five main occupations
occ_student = ifelse(dem_occ == 5, 1, 0),
occ_midlev = ifelse(dem_occ == 14, 1, 0),
occ_uprlev = ifelse(dem_occ == 15, 1, 0),
occ_never = ifelse(dem_occ == 1, 1, 0),
occ_manual = ifelse(dem_occ == 11, 1, 0),

#code binary vars for main religions
rel_catholic = ifelse(dem_rel == 1, 1, 0),
rel_protestant = ifelse(dem_rel == 2, 1, 0),
rel_evangelical = ifelse(dem_rel == 3, 1, 0),
rel_muslim = ifelse(dem_rel == 4, 1, 0),
rel_other = ifelse(dem_rel %in% c(0,5:7), 1, 0),

#create var whether voted previous election
voted = case_when(
  dem_vote_ke == 0 | dem_vote_ng == 0 | dem_vote_ug == 0 ~ 0,
  dem_vote_ke > 0 | dem_vote_ng > 0 | dem_vote_ug > 0 ~ 1),

#create var whether voted for incumbent
#1-voted for incumbent, 0-did not vote or did not vote for incumbent
voted_incumbent = case_when(
  dem_vote_ke == 1 | dem_vote_ng == 1 | dem_vote_ug == 1 ~ 1,
  dem_vote_ke != 1 | dem_vote_ng != 1 | dem_vote_ug != 1 ~ 0),

#create var for co-partisanship with incumbent president
copartisan = case_when(
  dem_party_ke == 6 | dem_party_ng == 1 | dem_party_ug == 1 ~ 1,
  dem_party_ke != 6 | dem_party_ng != 1 | dem_party_ug != 1 ~ 0),

#create var for vote choice or copartisan
voted_copartisan = ifelse(voted_incumbent == 1 |
  (!is.na(copartisan) & copartisan == 1), 1, 0)
)

```

## Additional cleaning

```

# Check that _TEXT vars are do not include systematically excluded categories

txt_var <- dat %>% dplyr::select(ends_with("_TEXT"))
# apply(txt_var, 2, table)

#----- loc_country_4_TEXT

# Manually input loc values for Nigeria residents
# table(dat$loc_country_4_TEXT)
dat$loc_country[dat$loc_country_4_TEXT %in%
  c("Nigeria", "nigeria", "Abuja")] <- 2

dat$country <- case_when(dat$loc_country == 1 ~ "Kenya",
  dat$loc_country == 2 ~ "Nigeria",
  dat$loc_country == 3 ~ "Uganda")

```

```

dat$loc_admin1[dat$loc_fe == "4_Nigeria_Calabar"] <- "5"
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Alagbado"] <- "6"
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Ikeja"] <- "6"
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Ibadan"] <- "6"
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Warri Delta State"] <- "5"
# dat$loc_admin1[dat$loc_fe == "4_Nigeria_Benin Republic"]
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Benin"] <- "5"
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Kaduna"] <- "3"
dat$loc_admin1[dat$loc_fe == "4_Nigeria_Ogbomosho"] <- "6"
dat$loc_admin1[dat$loc_fe == "4_Abuja_Keffi"] <- "1"
# dat$loc_admin1[dat$loc_fe == "4_nigeria_aw"]

dat$loc_fe[dat$loc_fe == "4_Nigeria_Calabar"] <- "2_5_24"
dat$loc_fe[dat$loc_fe == "4_Nigeria_Alagbado"] <- "2_6_28_5"
dat$loc_fe[dat$loc_fe == "4_Nigeria_Ikeja"] <- "2_6_28_13"
dat$loc_fe[dat$loc_fe == "4_Nigeria_Ibadan"] <- "2_6_32"
dat$loc_fe[dat$loc_fe == "4_Nigeria_Warri Delta State"] <- "2_5_26"
# dat$loc_fe[dat$loc_fe == "4_Nigeria_Benin Republic"]
dat$loc_fe[dat$loc_fe == "4_Nigeria_Benin"] <- "2_5_27"
dat$loc_fe[dat$loc_fe == "4_Nigeria_Kaduna"] <- "2_3_15"
dat$loc_fe[dat$loc_fe == "4_Nigeria_Ogbomosho"] <- "2_6_32"
dat$loc_fe[dat$loc_fe == "4_Abuja_Keffi"] <- "2_1_4"
# dat$loc_fe[dat$loc_fe == "4_nigeria_aw"]

#----- fact_response_7_TEXT

#REVIEW: Manually input these?

# 45 `Other, specify` responses for `fact_response_7_TEXT`
# dat$fact_response_7_TEXT[!is.na(dat$fact_response_7_TEXT)]

# 34 mention "isolate" or "quarantine" or "avoid contact"
# grep("(isol)|(quarant)|(contact)", a$fact_response_7_TEXT,
# value = TRUE, ignore.case = TRUE)

# 11 remaining
# setdiff(grep("(isol)|(quarant)|(contact)", a$fact_response_7_TEXT,
# value = TRUE, invert = TRUE, ignore.case = TRUE), NA)

#----- info1_9_TEXT
# 23 unique responses
# unique(dat$info1_9_TEXT)

#----- att_self_concern_8_TEXT

# 38 unique responses
# unique(dat$att_self_concern_8_TEXT)

# 10 mention "health"
# grep("(health)", a$att_self_concern_8_TEXT, value = TRUE, ignore.case = TRUE)

# 12 mention "food" or "income", "welfare", "low"
# grep("(food)|(feed)|(income)|(welfare)|(low)", a$att_self_concern_8_TEXT,

```

```

# value = TRUE, ignore.case = TRUE)

# 7 mention "economy"
# grep("(econom)", a$att_self_concern_8_TEXT, value = TRUE, ignore.case = TRUE)

# 13 remaining
# setdiff(grep("(food)|(feed)|(income)|(welfare)|(low)|(health)|(econom)", a$att_self_concern_8_TEXT, v

#----- att_concern_pol_own_7_TEXT
# 15 non-missing values
# unique(dat$att_concern_pol_own_7_TEXT)

#----- att_fam_concern_8_TEXT
# 12 non-missing values
# unique(dat$att_fam_concern_8_TEXT)

#----- att_concern_pol_they_7_TEXT
# 13 non-missing values
# unique(dat$att_concern_pol_they_7_TEXT)

#----- att_socmed_concern_8_TEXT
# 13 non-missing values
# unique(dat$att_socmed_concern_8_TEXT)

#----- dem_occ_16_TEXT
# REVIEW: 171 non-missing values
# unique(dat$dem_occ_16_TEXT)

#----- dem_rel_7_TEXT
# 30 non-missing values
# unique(dat$dem_rel_7_TEXT)

#----- dem_eth_ug_21_TEXT
# Manually recode ethnicities coded as "Other"
# table(dat$dem_eth_ug_21_TEXT)
dat$dem_eth[dat$dem_eth_ug_21_TEXT %in% c("Muteso")] <- "3_8"
dat$dem_eth[dat$dem_eth_ug_21_TEXT %in% c("Madi")] <- "3_13"
dat$dem_eth[dat$dem_eth_ug_21_TEXT %in% c("Samya","Samia")] <- "3_14"

#----- dem_eth_ng_28_TEXT
# table(dat$dem_eth_ng_28_TEXT)

#----- dem_eth_ke_16_TEXT
# table(dat$dem_eth_ke_16_TEXT)

```

## Rescale variables and create weights

```

dat <- dat %>%
  group_by(country) %>%
  mutate(hypo_answer_scaled = scale(hypo_answer)) %>%
  # mutate(hypo_answer_bsize = n(),
  #        wt = 1/3*(1/hypo_answer_bsize)) %>%

```

```
ungroup()
# mutate(wt = wt/sum(wt))
```

## Code text variable

```
# Dictionary created using 10% sample of responses
collective_terms <- c("\\<us\\>", "\\<we\\>", "\\<our\\>", "\\<ourselves\\>")
externality_terms <- c("(collab)", "(together)", "(others)", "(us all)",
  "(let us)", "(let's)", "(unit)", "(union)",
  "(one another)")
religious_terms <- c("\\<god\\>", "(pray)", "(bless)", "(Allah)", "(Lord)", "(relig)")
civic_terms <- c("(citizen)", "(our country)", "(our nation)")

dat$letter_col <- code_terms(collective_terms, dat$behav_letter)
dat$letter_ext <- code_terms(externality_terms, dat$behav_letter, perl = TRUE)
dat$letter_rel <- code_terms(religious_terms, dat$behav_letter, perl = TRUE)
dat$letter_civ <- code_terms(civic_terms, dat$behav_letter, perl = TRUE)
```

## Code lockdown

```
# Akwa Ibom, Kwara, Anambra, Niger, Lagos, Ogun, FCT, Ekiti, Delta,
# Osun (suspended for a day on April 15). Niger?
# Uganda nationwide

locked <- c("2_5_1", grep("2_6_28", dat$loc_fe, fixed = TRUE, value = TRUE),
  "2_6_29", "2_1_7", "2_1_3", "2_4_22", "2_1_5", "2_6_1", "2_5_26",
  "2_6_31")

dat %<>% mutate(lockdown = ifelse((loc_fe %in% locked) | country == "Uganda", 1, 0))
```

## Remove incomplete responses

```
# Remove respondents who attrited before completing the survey
# Last answer that was required was `dem_religiosity`, which 0.9131810193 of the
# starting sample completed

dat %<>% filter(!is.na(country) & Finished==1)
```

## Export Data

```
to_export <- dat %>%
  dplyr::select(StartDate:UserLanguage, consent, loc_country, country,
    loc_admin1, loc_admin2, loc_admin3, loc_admin4, loc_fe,
    loc_urbrur, fact_trueforyou, fact_trueforyou_1:fact_trueforyou_12,
    fact_truecovid, fact_truecovid_1:fact_truecovid_6,
    fact_tested, fact_tf_older:fact_reduce_spread,
    fact_reduce_spread_1:fact_reduce_spread_7,
    fact_response, fact_response_1:fact_response_7,
```

```

fact_numb_cases:info1, info2, info2_1:info2_4,
trust_cov_pres, trust_cov_moh, trust_cov_hwork, trust_cov_media,
trust_gov,
le_condition, le_count, le_control, le_treat,
at_lock_time:att_self_concern, att_concern_pol_own,
att_risk_ownhealth:att_fam_concern, att_concern_pol_they,
att_risk_ffhealth:att_socmed_concern,
att_lock_correct:att_lock_gap_abs,
hypo_condition, hypo_answer, hypo_answer_scaled,
hypo_norm0:hypo_norm2,
letter_col, letter_ext, letter_rel, letter_civ,
behav_write, behav_wrote, behav_letter,
remit, remit_1:remit_4, remit_rcv_amount_abr:remit_rcv_amt_dom,
female, dem_age:dem_occ, dem_vote_ug:dem_party_ug,
voted, voted_incumbent, copartisan, voted_copartisan,
dem_rel, dem_religiosity,
dem_eth, dem_eth_ug, dem_eth_ng, dem_eth_ke,
click_WHOLink, click_WHOphone, lockdown, occ_student:occ_manual,
rel_catholic:rel_other)

```

```

write_csv(to_export, file = "data/clean/covid_survey.csv")
saveRDS(to_export, file = "data/clean/covid_survey.RDS")

```