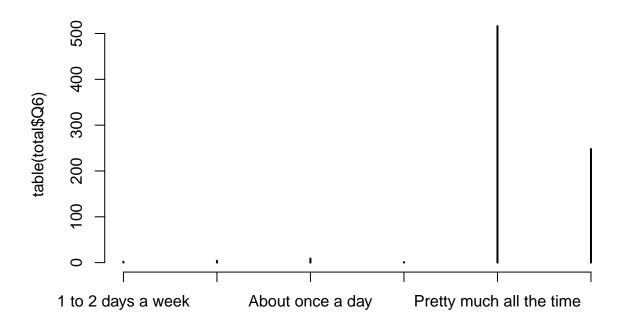
analyze_mturk_pap.R

kevin

Sun Mar 11 15:41:20 2018

```
##NOTE: we did a pilot of this experiment; results are analyzed here as they will be
##in the final version
setwd("C:/Users/kevin/Dropbox/clickbait/")
options(stringsAsFactors = FALSE)
library(foreign)
multiplot <- function(..., plotlist=NULL, file, cols=1, layout=NULL) {</pre>
 require(grid)
  # Make a list from the ... arguments and plotlist
 plots <- c(list(...), plotlist)</pre>
 numPlots = length(plots)
  # If layout is NULL, then use 'cols' to determine layout
  if (is.null(layout)) {
    # Make the panel
    # ncol: Number of columns of plots
    # nrow: Number of rows needed, calculated from # of cols
    layout <- matrix(seq(1, cols * ceiling(numPlots/cols)),</pre>
                     ncol = cols, nrow = ceiling(numPlots/cols))
  }
  if (numPlots==1) {
    print(plots[[1]])
  } else {
    # Set up the page
    grid.newpage()
    pushViewport(viewport(layout = grid.layout(nrow(layout), ncol(layout))))
    # Make each plot, in the correct location
    for (i in 1:numPlots) {
      # Get the i,j matrix positions of the regions that contain this subplot
      matchidx <- as.data.frame(which(layout == i, arr.ind = TRUE))</pre>
      print(plots[[i]], vp = viewport(layout.pos.row = matchidx$row,
                                       layout.pos.col = matchidx$col))
    }
 }
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
```

```
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
library(psych)
library(ggplot2)
##
## Attaching package: 'ggplot2'
## The following objects are masked from 'package:psych':
##
       %+%, alpha
##
require(reshape2)
## Loading required package: reshape2
data1<-read.csv("mturk_data/mturk_final_batch_1.csv")</pre>
data2<-read.csv("mturk_data/mturk_final_batch_1_cons.csv")</pre>
data3<-read.csv("mturk data/mturk final batch 2.csv")</pre>
data4<-read.csv("mturk_data/mturk_final_batch_2_cons.csv")</pre>
data_mt<-rbind(data1,data2,data3,data4)</pre>
q<-read.csv("mturk_data/qualtrics_final_batch_1.csv")</pre>
## delete the first tw0
q < -q[-1,]
q < -q[-1,]
total <-merge (q, data_mt, by.y="Answer.surveycode", by.x="MTurkCode")
## check that total only has distinct MTurkers
nrow(total)-length(unique(total$MTurkCode))
## [1] 0
##subset to only those who passed the attention check
bad<-filter(total, Q22 != "Survey taker: always select this option, ignore the other three headlines")
##reject the bad ones
total<-filter(total, Q22 == "Survey taker: always select this option, ignore the other three headlines"
total<-filter(total, Duration..in.seconds. > 180)
#####look at responses
##Q6 -- this is "how often do you use the internet" -- NICE they all use it all the time
plot(table(total$Q6))
```



```
##this is actually really annoying -- just create a new data frame
##annoying; have to update this every time
total$internet_use<-as.factor(total$Q6)</pre>
total$internet<- factor(total$internet_use,levels(total$internet_use)[c(4,1,2,3,6,5)])
pdf("results/internet_use.pdf", 7, 5)
ggplot(data.frame(total$internet),aes(total$internet)) + geom_bar(stat = "count")+
 scale_x_discrete("How often do you use the internet?",labels=c("0"="Less Often","1"="Every few weeks"
 theme(panel.grid.major = element_blank(),
      panel.grid.minor = element_blank(),
      panel.background = element_blank(), axis.text.x = element_text(angle = 300, hjust = 0))+
 ylab("Count") + ggtitle("MTurkers use the internet 'Pretty much all the time'")
dev.off()
## pdf
###calculate demographics
total$pid<-as.factor(total$Q12)</pre>
```

```
total$pid<- factor(total$pid,levels(total$pid)[c(1, 3, 2, 4,5)])
pdf("results/pid.pdf", 7, 5)
ggplot(data.frame(total$pid),aes(total$pid)) + geom_bar(stat = "count")+ scale_x_discrete(drop=FALSE)+
  theme(panel.grid.major = element_blank(),
        panel.grid.minor = element_blank(),
        panel.background = element_blank(), axis.text.x = element_text(angle = 300, hjust = 0))+
  ylab("Count") +
  xlab("") + ggtitle("Subject partisan identification")
dev.off()
## pdf
##
##age
total$age <- as.numeric(total$Q3)</pre>
pdf("results/age.pdf", 7, 5)
hist(total$age)
dev.off()
## pdf
##
##education
total$educ<-as.factor(total$Q5)</pre>
total$educ<- factor(total$educ,levels(total$educ)[c(2, 3, 5, 1, 4)])
pdf("results/educ.pdf", 7, 5)
ggplot(data.frame(total$educ),aes(total$educ)) + geom_bar(stat = "count")+ scale_x_discrete(drop=FALSE)
  theme(panel.grid.major = element_blank(),
        panel.grid.minor = element_blank(),
        panel.background = element_blank(), axis.text.x = element_text(angle = 300, hjust = 0))+
  ylab("Count") +
  xlab("") + ggtitle("Subject Education")
dev.off()
## pdf
##facebook use
total$fb<-as.factor(total$Q9)</pre>
total$fb<- factor(total$fb,levels(total$fb)[c(5,6,4, 1,2,3,8,7)])
```

```
pdf("results/fb.pdf", 7, 5)
ggplot(data.frame(total$fb),aes(total$fb)) + geom_bar(stat = "count")+ scale_x_discrete(drop=FALSE)+
  theme(panel.grid.major = element_blank(),
        panel.grid.minor = element_blank(),
        panel.background = element_blank(), axis.text.x = element_text(angle = 300, hjust = 0))+
 ylab("Count") +
  xlab("") + ggtitle("Subject Facebook Use")
dev.off()
## pdf
##
##twitter use
total$twitter<-as.factor(total$Q11)</pre>
total$twitter<- factor(total$twitter,levels(total$twitter)[c(5,6,4, 1,2,3,8,7)])
pdf("results/twitter.pdf", 7, 5)
ggplot(data.frame(total$twitter),aes(total$twitter)) + geom_bar(stat = "count")+ scale_x_discrete(drop=
  theme(panel.grid.major = element_blank(),
        panel.grid.minor = element_blank(),
        panel.background = element_blank(), axis.text.x = element_text(angle = 300, hjust = 0))+
 ylab("Count") +
  xlab("") + ggtitle("Subject Twitter Use")
dev.off()
## pdf
##
##measure which stories they looked at
##just count how often they clicked each kind of story
total$R_CB<-0
total$D_CB<-0
total$R_normal<-0
total$D_normal<-0
##going through and putting #'s for the ones that aren't emotional clickbait
#total$Q16.1
total$R_CB[total$Q16.1 =="People are loving this: President Trump dismisses mainstream media frenzy abo
total$D_normal[total$Q16.1 =="Report shows that climate change is much worse than previously feared"] <-
#total$Q21
```

```
total$D_CB[total$Q21 =="This is why President Trump's plan for dealing with North Korea is a disaster"]
total$R_normal[total$Q21 =="Planned Parenthood on the ropes as funding slashed"]<-1 + total$R_normal[to
#total$Q23
total$R_CB[total$Q23 =="This is what the Mexican border wall will empower local governments to do"]<-1
total$D_normal[total$Q23 =="Media investigations keep finding new information about Russia allegations"
#total$Q20
total$D_CB[total$Q20 =="This will make you furious: new email evidence shows Donald Trump, Jr., conspir
total$R_normal[total$Q20 =="Supreme Court allows the popular travel ban to take effect"]<-1 + total$R_n
#total$Q24
total$R_CB[total$Q24 =="Democrats are freaking out: evidence from Seattle shows raising minimum wages c
total$D_normal[total$Q24 =="Mexican border wall to nearly bankrupt local government"]<-1 + total$D_norm
#total$Q19
total$D_CB[total$Q19 =="5 things you need to know about the Supreme Court's cowardly travel ban approva
total$R_normal[total$Q19 =="Donald Trump, Jr., under attack for doing nothing wrong"]<-1 + total$R_norm
#total$Q25
total$R_CB[total$Q25 =="10 reasons that climate change isn't a serious problem"]<-1 + total$R_CB[total$
total$D_normal[total$Q25 =="Seattle's minimum wage increase shows that paying people more actually work
#total$Q18
total$D_CB[total$Q18 =="Republicans are shocked to see that slashing funding to Planned Parenthood incr
total$R_normal[total$Q18 =="President Trump's bold new plan for dealing with North Korea"]<-1 + total$R
##summary of preferences----people preferred (slighlty) the non-clickbait
summary(total$D_CB)
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                              Max.
##
     0.000
           1.000
                     2.000
                             1.529
                                     2.000
                                             4.000
summary(total$R_CB)
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
     0.000
           0.000
                    1.000
                             1.356
                                     2.000
                                             4.000
summary(total$D_normal)
```

Max.

4.000

Mean 3rd Qu.

3.000

1.671

##

0.000

summary(total\$R_normal)

Min. 1st Qu. Median

1.000

2.000

```
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
##
     0.000
             1.000
                     2.000
                              1.604
                                      2,000
                                               4.000
dems<-filter(total, pid == "Democrat" | pid == "Lean Democrat")</pre>
reps<-filter(total, pid == "Republican" | pid == "Lean Republican")
inds<-filter(total, pid == "Independent")</pre>
summary(dems$D CB)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
     0.000
             1.000
                     2.000
                              1.931
                                      3.000
                                               4.000
summary(dems$R_CB)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
    0.0000 0.0000 1.0000
                             0.8229 1.0000
                                             4.0000
summary(dems$D_normal)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
     0.000
             1.750
                      2.000
                              2.219
                                      3.000
                                               4.000
summary(dems$R_normal)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
     0.000
             1.000
                      1.000
                              1.205
                                      2.000
                                               4.000
summary(reps$D_CB)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
     0.000
             0.000
                      1.000
                              1.172
                                      2.000
                                               4.000
summary(reps$R_CB)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
     0.000
             1.000
                     2.000
                              1.955
                                      3.000
                                               4.000
summary(reps$D_normal)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
             0.000
     0.000
                      1.000
                              1.082
                                      2.000
                                               4.000
summary(reps$R_normal)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
     0.000
             1.000
                     2,000
                              2.037
                                      3.000
                                               4.000
##plotting density of news consumption --> people prefer like-minded and non-CB; republicans are slight
pdf("results/choiceNews.pdf", 7, 5)
p1<-ggplot()+
  geom_density(data=total,aes(D_CB),colour="blue",adjust=2.4,size=1,linetype = 2) +
  geom_density(data=total,aes(D_normal),colour="blue",adjust=2.1,size=1)+
  geom_density(data=total,aes(R_CB),colour="red",adjust=2.3,size=1,linetype = 2)+
  geom_density(data=total,aes(R_normal),colour="red",adjust=2.4,size=1)+
  ggtitle("Choice of news") + xlab("Red=Republican, Dashed=Clickbait")
p2<-ggplot()+
  geom_density(data=dems,aes(D_CB),colour="blue",adjust=1.8,size=1,linetype = 2) +
  geom_density(data=dems,aes(D_normal),colour="blue",adjust=1.8,size=1)+
```

```
geom_density(data=dems,aes(R_CB),colour="red",adjust=2,size=1,linetype = 2)+
  geom_density(data=dems,aes(R_normal),colour="red",adjust=2,size=1)+
  ggtitle("Choice of news for Democrats") + xlab("Red=Republican, Dashed=Clickbait")
p3<-ggplot()+
  geom_density(data=reps,aes(D_CB),colour="blue",adjust=1.8,size=1,linetype = 2) +
  geom_density(data=reps,aes(D_normal),colour="blue",adjust=1.8,size=1)+
  geom density(data=reps,aes(R CB),colour="red",adjust=2,size=1,linetype = 2)+
  geom_density(data=reps,aes(R_normal),colour="red",adjust=2,size=1)+
  ggtitle("Choice of news for Republicans") + xlab("Red=Republican, Dashed=Clickbait")
multiplot(p1,p2,p3,cols=2)
## Loading required package: grid
dev.off()
## pdf
##
total$CB<-total$D_CB + total$R_CB</pre>
total$normal<-total$D_normal + total$R_normal</pre>
total$political<-total$CB + total$normal
summary(total$political)
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
##
      0.00
             5.00
                      7.00
                                               8.00
                              6.16
                                       8.00
total$pfc<-total$CB / total$political</pre>
summary(total$pfc)
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                                       NA's
                                               Max.
   0.0000 0.3333 0.5000 0.4583 0.5714 1.0000
##only 1 person chose 0 political stories
total$R<-total$R_normal + total$R_CB</pre>
total$D<-total$D_normal + total$D_CB
total$pfr<-total$R/total$political
total$pfd<-total$D/total$political
\#\#so we have pfc , pfd , and pfr as the main choice variables
##let's check: pfd / pfc among partisans
dems<-filter(total, pid == "Democrat" | pid == "Lean Democrat")</pre>
reps<-filter(total, pid == "Republican" | pid == "Lean Republican")
summary(dems$pfd)
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                                       NA's
  0.0000 0.5000 0.6667 0.6635 0.8333 1.0000
summary(reps$pfd)
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
                                                       NA's
```

```
## 0.0000 0.1429 0.3750 0.3708 0.5357 1.0000
summary(dems$pfr)
##
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                            Max.
                                                    NA's
## 0.0000 0.1667 0.3333 0.3365 0.5000 1.0000
                                                       2
summary(reps$pfr)
     Min. 1st Qu. Median
                             Mean 3rd Qu.
                                            Max.
                                                    NA's
  0.0000 0.4643 0.6250 0.6292 0.8571
                                          1.0000
##that's plausible -- so let's check pfc along the major lines
## only internet consumption is significant --> frequent users are more used to CB?
summary(lm(pfc ~ as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + age + as.numeric(educ) +
##
## Call:
## lm(formula = pfc ~ as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) +
##
      age + as.numeric(educ) + pid, data = total)
##
## Residuals:
##
       Min
                 1Q
                      Median
                                   3Q
                                          Max
## -0.52361 -0.10331 0.00848 0.11476 0.58871
##
## Coefficients:
##
                         Estimate Std. Error t value Pr(>|t|)
                        0.2805878 0.0810356
                                              3.463 0.000565 ***
## (Intercept)
## as.numeric(fb)
                        0.0054289
                                  0.0034172
                                              1.589 0.112542
                        0.0031378
## as.numeric(twitter)
                                  0.0030274
                                              1.036 0.300312
## as.numeric(internet) 0.0137158
                                  0.0118650
                                              1.156 0.248047
## age
                        0.0017164 0.0005839
                                             2.940 0.003385 **
## as.numeric(educ)
                       ## pidLean Democrat
                       -0.0303052 0.0241761 -1.254 0.210404
## pidIndependent
                                              0.201 0.840737
                        0.0038461
                                  0.0191328
## pidLean Republican
                        0.0629778 0.0216124
                                              2.914 0.003674 **
## pidRepublican
                        0.0201500 0.0222740 0.905 0.365944
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1912 on 758 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.04311,
                                  Adjusted R-squared: 0.03175
## F-statistic: 3.795 on 9 and 758 DF, p-value: 0.0001067
summary(lm(pfc ~ (fb) + (twitter) + (internet) + age + (educ) +pid, data = total))
##
## Call:
## lm(formula = pfc ~ (fb) + (twitter) + (internet) + age + (educ) +
##
      pid, data = total)
##
## Residuals:
##
       Min
                 1Q
                      Median
                                   3Q
                                          Max
## -0.53681 -0.10587 0.00437 0.11835 0.58217
```

##

```
## Coefficients:
##
                                  Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                 0.1361997 0.2265263 0.601 0.54786
## fbLess often
                                 0.0300232 0.0399213 0.752 0.45225
                                 0.0123622 0.0394768 0.313 0.75425
## fbEvery few weeks
## fb1 to 2 days a week
                               0.0325966 0.0374760 0.870 0.38469
0.0349630 0.0424061 0.824 0.40993
## fb3 to 6 days a week
                                 0.0462080 0.0291906 1.583 0.11386
## fbAbout once a day
## fbSeveral times a day
                                 0.0423691 0.0266798 1.588 0.11270
## fbPretty much all the time
                                0.0371848 0.0355388 1.046 0.29576
## twitterLess often
                                0.0172521 0.0260630 0.662 0.50822
                                 0.0334616 0.0274986 1.217 0.22405
## twitterEvery few weeks
## twitter1 to 2 days a week
                               -0.0040102 0.0246315 -0.163 0.87071
## twitter3 to 6 days a week
                                -0.0146018 0.0274409 -0.532 0.59480
## twitterAbout once a day
                                 0.0541958 0.0240594 2.253 0.02458 *
## twitterSeveral times a day
                                 0.0220960 0.0219731 1.006 0.31494
## twitterPretty much all the time 0.0223815 0.0418264 0.535 0.59274
## internet1 to 2 days a week -0.0581829 0.2391097 -0.243 0.80782
## internet3 to 6 days a week
                                 0.2872022 0.2170143 1.323 0.18610
                                 0.2391132 0.2036272 1.174 0.24067
## internetAbout once a day
## internetSeveral times a day
                                0.2453519 0.1938509 1.266 0.20603
## internetPretty much all the time 0.2498989 0.1938603 1.289 0.19778
                                  0.0017447 0.0005986 2.915 0.00367 **
## age
                                 ## educHigh school
## educSome college
                                -0.0248452 0.1123845 -0.221 0.82510
                                 -0.0619086 0.1125672 -0.550 0.58251
## educCollege
## educPostgraduate degree
                                 -0.0576978 0.1136508 -0.508 0.61183
## pidLean Democrat
                                -0.0319791 0.0243426 -1.314 0.18935
## pidIndependent
                                -0.0024847 0.0192723 -0.129 0.89745
## pidLean Republican
                                 0.0599090 0.0218506 2.742 0.00626 **
                                 0.0222741 0.0224498 0.992 0.32144
## pidRepublican
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.1911 on 739 degrees of freedom
    (12 observations deleted due to missingness)
## Multiple R-squared: 0.06767, Adjusted R-squared: 0.03235
## F-statistic: 1.916 on 28 and 739 DF, p-value: 0.003195
summary(lm(pfc ~ as.numeric(fb) , data = total))
##
## Call:
## lm(formula = pfc ~ as.numeric(fb), data = total)
##
## Residuals:
                1Q
                   Median
       Min
## -0.47348 -0.10770 0.03301 0.11092 0.56545
##
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
                0.421571
                          0.020355 20.711
## (Intercept)
                                            <2e-16 ***
## as.numeric(fb) 0.006489
                          0.003375
                                    1.922
                                            0.0549 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

```
##
## Residual standard error: 0.194 on 766 degrees of freedom
   (12 observations deleted due to missingness)
## Multiple R-squared: 0.004801, Adjusted R-squared: 0.003502
## F-statistic: 3.696 on 1 and 766 DF, p-value: 0.05493
summary(lm(pfc ~ as.numeric(twitter) , data = total))
##
## Call:
## lm(formula = pfc ~ as.numeric(twitter), data = total)
## Residuals:
##
       Min
                 1Q
                     Median
                                   3Q
                                           Max
## -0.46586 -0.11975 0.03596 0.11835 0.54692
##
## Coefficients:
##
                      Estimate Std. Error t value Pr(>|t|)
                                 0.013359 33.778 <2e-16 ***
## (Intercept)
                      0.451254
## as.numeric(twitter) 0.001826
                                 0.002940
                                            0.621
                                                     0.535
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.1944 on 766 degrees of freedom
    (12 observations deleted due to missingness)
## Multiple R-squared: 0.0005034, Adjusted R-squared: -0.0008014
## F-statistic: 0.3858 on 1 and 766 DF, p-value: 0.5347
summary(lm(pfc ~ (age) , data = total))
##
## Call:
## lm(formula = pfc ~ (age), data = total)
## Residuals:
                 1Q
##
       Min
                     Median
                                   3Q
                                           Max
## -0.50283 -0.10872 0.00705 0.11900 0.57623
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 0.3842400 0.0223745 17.173 < 2e-16 ***
              0.0019765 0.0005674
                                   3.484 0.000523 ***
## age
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1929 on 766 degrees of freedom
    (12 observations deleted due to missingness)
## Multiple R-squared: 0.0156, Adjusted R-squared: 0.01431
## F-statistic: 12.14 on 1 and 766 DF, p-value: 0.0005228
summary(lm(pfc ~ (internet) , data = total))
##
## Call:
## lm(formula = pfc ~ (internet), data = total)
```

##

```
## Residuals:
##
       Min
                     Median
                 10
                                   30
                                            Max
## -0.46023 -0.12518 0.03977 0.11291 0.54149
## Coefficients:
##
                                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                                0.1940
                                     0.2500
                                                        1.289
## internet1 to 2 days a week
                                     -0.1250
                                                 0.2376 - 0.526
                                                                   0.599
## internet3 to 6 days a week
                                     0.2333
                                                 0.2169
                                                          1.076
                                                                   0.282
## internetAbout once a day
                                     0.1806
                                                 0.2045
                                                         0.883
                                                                   0.378
## internetSeveral times a day
                                     0.2085
                                                 0.1944
                                                         1.073
                                                                   0.284
## internetPretty much all the time
                                                          1.083
                                                                   0.279
                                     0.2102
                                                 0.1942
## Residual standard error: 0.194 on 762 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.009564,
                                   Adjusted R-squared:
## F-statistic: 1.472 on 5 and 762 DF, p-value: 0.1967
summary(lm(pfc ~ (educ) , data = total))
##
## Call:
## lm(formula = pfc ~ (educ), data = total)
## Residuals:
##
       Min
                 1Q
                     Median
                                    3Q
                                            Max
## -0.48304 -0.11314 0.01696 0.12495 0.55352
## Coefficients:
##
                           Estimate Std. Error t value Pr(>|t|)
                                                4.251 2.39e-05 ***
## (Intercept)
                                      0.112021
                           0.476190
## educHigh school
                           -0.038193
                                      0.113980
                                                -0.335
                                                          0.738
## educSome college
                            0.006849
                                      0.112722
                                                 0.061
                                                          0.952
## educCollege
                           -0.029713
                                      0.112512
                                                -0.264
                                                          0.792
## educPostgraduate degree -0.019857
                                      0.113689
                                                -0.175
                                                          0.861
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.194 on 763 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.007955, Adjusted R-squared:
## F-statistic: 1.53 on 4 and 763 DF, p-value: 0.1917
summary(lm(pfc ~ (pid) , data = total))
##
## Call:
## lm(formula = pfc ~ (pid), data = total)
##
## Residuals:
##
       Min
                 1Q
                     Median
                                    3Q
                                            Max
## -0.51345 -0.11317 0.02086 0.12381 0.59229
##
## Coefficients:
##
                       Estimate Std. Error t value Pr(>|t|)
```

```
## (Intercept)
                    ## pidLean Democrat -0.038797 0.024143 -1.607 0.10848
## pidIndependent 0.001116 0.019039 0.059 0.95329
## pidLean Republican 0.066951
                                 0.021576 3.103 0.00199 **
## pidRepublican
                      0.026837
                               0.022019 1.219 0.22327
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.1923 on 763 degrees of freedom
    (12 observations deleted due to missingness)
## Multiple R-squared: 0.02546,
                                   Adjusted R-squared: 0.02035
## F-statistic: 4.983 on 4 and 763 DF, p-value: 0.0005715
##plot means different conditions
dems_nl<-filter(total, pid == "Democrat" )</pre>
reps_nl<-filter(total, pid == "Republican" )</pre>
dems<-filter(total, pid == "Democrat" | pid == "Lean Democrat")</pre>
reps<-filter(total, pid == "Republican" | pid == "Lean Republican")</pre>
inds<-filter(total, pid == "Independent" )</pre>
mean(dems$pfc, na.rm = T)
## [1] 0.4336164
mean(reps$pfc, na.rm = T)
## [1] 0.4940838
mean(inds$pfc, na.rm = T)
## [1] 0.447619
mean(dems_nl$pfc, na.rm = T)
## [1] 0.4465034
mean(reps_nl$pfc, na.rm = T)
## [1] 0.4733408
##########now, let's look at the actual experiment
##create dummies for treatments
total$treatment_R_CB<-0
total$treatment_D_CB<-0
total$treatment_R_nonCB<-0
total$treatment_D_nonCB<-0
total treatment_D_nonCB[total QID29 == "I've read the story carefully, and I'm ready to continue the surv
total$treatment_D_CB[total$QID30=="I've read the story carefully, and I'm ready to continue the survey"
total$treatment_R_nonCB[total$Q31=="I've read the story carefully, and I'm ready to continue the survey
total$treatment_R_CB[total$Q32=="I've read the story carefully, and I'm ready to continue the survey"]<
total$treatment_R<-total$treatment_R_CB+total$treatment_R_nonCB
total$treatment_CB<-total$treatment_R_CB+total$treatment_D_CB
```

```
total$treatment<-1
total$treatment[total$treatment_D_CB==1]<-2</pre>
total$treatment[total$treatment_R_nonCB==1]<-3</pre>
total$treatment[total$treatment R CB==1]<-4
total$treatment<-factor(total$treatment, labels=c("Dem_non", "Dem_CB", "Rep_non", "Rep_CB"))
Tr_CB<-filter(total, total$treatment_CB=="1")</pre>
Tr_nonCB<-filter(total, total$treatment_CB=="0")</pre>
total$trust_offline<-0
total$trust_offline[total$QID13=="Not very much"]<-1</pre>
total$trust_offline[total$QID13=="A fair amount"]<-2</pre>
total$trust_offline[total$QID13=="A great deal"]<-3
## trust offline: mean and distribution are identical between treatments
summary(Tr_CB$trust_offline)
## Length Class
                  Mode
                  NULL
           NULL
summary(Tr nonCB$trust offline)
## Length Class
                  Mode
##
       Ω
          NULL
                  NUI.I.
pdf("results/Trust_offline_kernel.pdf", 7, 5)
dev.off()
## pdf
## analysis of trust online
total$trust_online<-0
total$trust_online[total$QID14=="Not very much"]<-1
total$trust_online[total$QID14=="A fair amount"]<-2</pre>
total$trust_online[total$QID14=="A great deal"]<-3
## interesting --> Trust Online higher under republican news treatment, CB does not influence the distr
pdf("results/trust_online_kernel.pdf", 7, 5)
ggplot(total,aes(x=trust_online, colour=treatment)) + geom_density(adjust=2.1,size=1) +ggtitle("Trust in
dev.off()
## pdf
dems<-filter(total, pid == "Democrat" | pid == "Lean Democrat")</pre>
reps<-filter(total, pid == "Republican" | pid == "Lean Republican")
#########3
####create graphs to compare averages
##########3
```

```
####Trust in offline media
## effect of treatments on means for general population
pd <- position_dodge(0.1) # move them .05 to the left and right
summ_trust_off<-total %>% group_by(treatment) %>%
  summarise(mean_PL = mean(trust_offline),
            sd_PL = sd(trust_offline),
            n_PL = n(),
            SE_PL = sd(trust_offline)/sqrt(n()))
pdf("results/trust_offline.pdf", 7, 5)
p1<-ggplot(summ_trust_off, aes(treatment, mean_PL)) +</pre>
  geom_errorbar(aes(ymin=mean_PL-SE_PL, ymax=mean_PL+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd)+ggtitle("trust in offline media, all")
#effects on Democrats
summ_trust_off_dems<-dems %>% group_by(treatment) %>%
  summarise(mean_PL = mean(trust_offline),
            sd_PL = sd(trust_offline),
            n_PL = n(),
            SE_PL = sd(trust_offline)/sqrt(n()))
p2<-ggplot(summ_trust_off_dems, aes(treatment, mean_PL)) +</pre>
  geom_errorbar(aes(ymin=mean_PL-SE_PL, ymax=mean_PL+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd)+ggtitle("trust in offline media, Democrats")
#effects on Republicans
summ_trust_off_reps<-reps %>% group_by(treatment) %>%
  summarise(mean_PL = mean(trust_offline),
            sd_PL = sd(trust_offline),
            n_PL = n(),
            SE_PL = sd(trust_offline)/sqrt(n()))
p3<-ggplot(summ_trust_off_reps, aes(treatment, mean_PL)) +
  geom_errorbar(aes(ymin=mean_PL-SE_PL, ymax=mean_PL+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("trust in offline media, Republicans")
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
   2
```

```
##as a regression --> not significant
summary(lm(trust_offline ~ treatment, data = total))
##
## Call:
## lm(formula = trust_offline ~ treatment, data = total)
## Residuals:
##
      Min
                1Q Median
                               3Q
                                      Max
## -1.5202 -0.4639 -0.4368 0.5606
                                  1.5632
## Coefficients:
                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                               0.05631
                                        26.997
                    1.52020
                                                 <2e-16 ***
## treatmentDem_CB -0.08336
                               0.08047
                                        -1.036
                                                  0.301
## treatmentRep_non -0.05628
                               0.08004 - 0.703
                                                  0.482
## treatmentRep_CB -0.08081
                               0.07963 -1.015
                                                  0.311
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.7923 on 776 degrees of freedom
## Multiple R-squared: 0.001811,
                                  Adjusted R-squared:
## F-statistic: 0.4693 on 3 and 776 DF, p-value: 0.7038
summary(lm(trust_offline ~ treatment + as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + ag
##
## Call:
## lm(formula = trust_offline ~ treatment + as.numeric(fb) + as.numeric(twitter) +
##
       as.numeric(internet) + age + as.numeric(educ) + pid, data = total)
##
## Residuals:
       Min
                 1Q
                      Median
                                   3Q
## -1.86547 -0.44572 -0.05491 0.56417
##
## Coefficients:
##
                        Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                        2.578302 0.317693
                                             8.116 1.92e-15 ***
## treatmentDem_CB
                       -0.072062
                                   0.075084 -0.960 0.337481
## treatmentRep_non
                       -0.094839
                                   0.074618 -1.271 0.204117
## treatmentRep_CB
                       -0.080688
                                   0.074449 -1.084 0.278794
## as.numeric(fb)
                        0.013220
                                   0.013070
                                             1.011 0.312126
## as.numeric(twitter)
                                   0.011560
                                             0.786 0.432132
                        0.009086
## as.numeric(internet) -0.167964
                                   0.045541 -3.688 0.000242 ***
                                   0.002240 -2.894 0.003913 **
## age
                       -0.006482
## as.numeric(educ)
                        0.107713
                                   0.031217
                                              3.450 0.000590 ***
## pidLean Democrat
                                   0.092808 -2.088 0.037158 *
                       -0.193751
## pidIndependent
                       -0.487223
                                   0.073271 -6.650 5.58e-11 ***
## pidLean Republican
                       -0.482203
                                   0.082695 -5.831 8.11e-09 ***
## pidRepublican
                       -0.665650
                                   0.085481 -7.787 2.22e-14 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.7361 on 767 degrees of freedom
```

```
## Multiple R-squared: 0.1485, Adjusted R-squared: 0.1351
## F-statistic: 11.14 on 12 and 767 DF, p-value: < 2.2e-16
####Trust in online media
## effect of treatments on means for general population
summ_trust<-total %>% group_by(treatment) %>%
  summarise(mean_PL = mean(trust_online),
            sd PL = sd(trust online),
            n_PL = n(),
            SE_PL = sd(trust_online)/sqrt(n()))
pdf("results/trust_online.pdf", 7, 5)
p1<-ggplot(summ_trust, aes(treatment, mean_PL)) +</pre>
  geom_errorbar(aes(ymin=mean_PL-SE_PL, ymax=mean_PL+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd)+ggtitle("trust in online media for the whole population")
#effects on Democrats
summ_trust_dems<-dems %>% group_by(treatment) %>%
  summarise(mean PL = mean(trust online),
            sd PL = sd(trust online),
            n_PL = n(),
            SE_PL = sd(trust_online)/sqrt(n()))
p2<-ggplot(summ_trust_dems, aes(treatment, mean_PL)) +</pre>
  geom_errorbar(aes(ymin=mean_PL-SE_PL, ymax=mean_PL+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd)+ggtitle("trust in online media for Democrats")
#effects on Republicans
summ_trust_reps<-reps %>% group_by(treatment) %>%
  summarise(mean_PL = mean(trust_online),
            sd_PL = sd(trust_online),
            n PL = n(),
            SE_PL = sd(trust_online)/sqrt(n()))
p3<-ggplot(summ trust reps, aes(treatment, mean PL)) +
  geom_errorbar(aes(ymin=mean_PL-SE_PL, ymax=mean_PL+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("trust in online media for Republicans")
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
```

```
##as a regression --> not significant
summary(lm(trust_online ~ treatment, data = total))
##
## Call:
## lm(formula = trust_online ~ treatment, data = total)
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -1.4040 -0.3263 -0.2879 0.6737 1.7121
## Coefficients:
                   Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                               0.04714 27.318
                    1.28788
                                                 <2e-16 ***
## treatmentDem_CB
                    0.03844
                               0.06737
                                         0.571
                                                 0.5685
                               0.06701
## treatmentRep_non 0.02140
                                         0.319
                                                 0.7496
## treatmentRep_CB
                    0.11616
                               0.06667
                                         1.742
                                                 0.0818 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.6634 on 776 degrees of freedom
## Multiple R-squared: 0.00443,
                                   Adjusted R-squared:
## F-statistic: 1.151 on 3 and 776 DF, p-value: 0.3277
summary(lm(trust_online ~ treatment + as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + age
##
## Call:
## lm(formula = trust_online ~ treatment + as.numeric(fb) + as.numeric(twitter) +
##
      as.numeric(internet) + age + as.numeric(educ) + pid, data = total)
##
## Residuals:
      Min
               1Q Median
                               3Q
                                      Max
## -1.6097 -0.3944 -0.1791 0.5677
##
## Coefficients:
##
                         Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                        1.5067742 0.2796890 5.387 9.52e-08 ***
## treatmentDem_CB
                        0.0407182 0.0661021
                                               0.616 0.53808
## treatmentRep_non
                       -0.0006198
                                   0.0656920 -0.009 0.99248
## treatmentRep_CB
                        0.1151676 0.0655432
                                               1.757 0.07930 .
## as.numeric(fb)
                        0.0173320 0.0115066
                                               1.506 0.13241
## as.numeric(twitter)
                        0.0433328
                                   0.0101772
                                               4.258 2.32e-05 ***
## as.numeric(internet) -0.0567040
                                   0.0400935 -1.414 0.15768
                                   0.0019718 -1.529 0.12672
## age
                       -0.0030145
## as.numeric(educ)
                        0.0218641
                                   0.0274830
                                              0.796 0.42654
## pidLean Democrat
                                   0.0817056 -1.231
                       -0.1005404
                                                     0.21888
## pidIndependent
                       -0.1710337
                                   0.0645059 -2.651
                                                     0.00818 **
## pidLean Republican
                       -0.2046589
                                   0.0728021 - 2.811
                                                     0.00506 **
## pidRepublican
                       -0.1715184 0.0752550 -2.279 0.02293 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 0.6481 on 767 degrees of freedom
```

```
## Multiple R-squared: 0.06087,
                                    Adjusted R-squared: 0.04618
## F-statistic: 4.143 on 12 and 767 DF, p-value: 2.577e-06
harddems<-filter(total, pid == "Democrat")</pre>
hardreps<-filter(total, pid == "Republican")</pre>
inds<-filter(total, pid == "Independent")</pre>
#########3
#### feelings analysis
######3
## towards Dem
######3
##general pop
summ_feeldem<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
            sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
##dems
summ_feeldem_dem<-dems %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
            sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
##reps
summ_feeldem_rep<-reps %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
            sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
##harddems
summ_feeldem_hdem<-harddems %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
            sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
##Hardreps
summ_feeldem_hrep<-hardreps %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
            sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
##Indipendents
summ_feeldem_inds<-inds %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
            sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
```

```
pdf("results/feeldem.pdf", 7, 5)
p1<-ggplot(summ_feeldem, aes(treatment, sentiment)) +</pre>
  geom errorbar(aes(ymin=sentiment-SE PL, ymax=sentiment+SE PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, all")
p2<-ggplot(summ_feeldem_dem, aes(treatment, sentiment)) +</pre>
  geom errorbar(aes(ymin=sentiment-SE PL, ymax=sentiment+SE PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, Democrats")
p3<-ggplot(summ_feeldem_rep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, Republicans")
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
pdf("results/feeldem bis.pdf", 7, 5)
p4<-ggplot(summ_feeldem_hdem, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, HardDemocrats")
p5<-ggplot(summ_feeldem_hrep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, HardRepublicans")
multiplot(p1,p2,p3,p4,p5,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
```

```
##t-tests. Dem_CB makes Republicans significantly more pro-Dems, while the effect on Dems is insignific
t.test(as.numeric(total$Q15_1)[total$treatment=="Dem_CB"],as.numeric(total$Q15_1)[total$treatment!="Dem_CB"]
##
   Welch Two Sample t-test
## data: as.numeric(total$Q15_1)[total$treatment == "Dem_CB"] and as.numeric(total$Q15_1)[total$treatm
## t = 0.34842, df = 322.28, p-value = 0.7278
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -4.163673 5.955823
## sample estimates:
## mean of x mean of y
## 46.98421 46.08814
t.test(as.numeric(dems$Q15_1)[dems$treatment=="Dem_CB"],as.numeric(dems$Q15_1)[dems$treatment!="Dem_CB"]
## Welch Two Sample t-test
##
## data: as.numeric(dems$Q15_1)[dems$treatment == "Dem_CB"] and as.numeric(dems$Q15_1)[dems$treatment
## t = 1.264, df = 112.45, p-value = 0.2089
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -1.826632 8.264132
## sample estimates:
## mean of x mean of y
## 75.56250 72.34375
t.test(as.numeric(reps$Q15_1)[reps$treatment=="Dem_CB"],as.numeric(reps$Q15_1)[reps$treatment!="Dem_CB"]
##
  Welch Two Sample t-test
## data: as.numeric(reps$Q15_1)[reps$treatment == "Dem_CB"] and as.numeric(reps$Q15_1)[reps$treatment
## t = 1.8653, df = 130.21, p-value = 0.06438
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.3410052 11.5979309
## sample estimates:
## mean of x mean of y
## 27.05333 21.42487
### regression analysis
summary(lm(as.numeric(Q15_1) ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.n
##
## Call:
## lm(formula = as.numeric(Q15_1) ~ treatment + as.numeric(fb) +
       as.numeric(CB) + as.numeric(twitter) + as.numeric(internet) +
##
       age + as.numeric(educ) + pid, data = total)
##
## Residuals:
                1Q Median
                                3Q
## -76.416 -13.687
                    0.848 12.619 78.623
##
```

```
## Coefficients:
##
                        Estimate Std. Error t value Pr(>|t|)
                        98.47025
## (Intercept)
                                    9.37628 10.502 < 2e-16 ***
## treatmentDem_CB
                                    2.21047
                                             0.893 0.372030
                         1.97439
## treatmentRep_non
                        -2.17033
                                    2.19633 -0.988 0.323386
## treatmentRep CB
                                    2.19113 -0.702 0.482997
                        -1.53780
## as.numeric(fb)
                         0.89635
                                    0.38468
                                             2.330 0.020057 *
## as.numeric(CB)
                        -0.54907
                                    0.55248 -0.994 0.320618
## as.numeric(twitter)
                        -0.81604
                                    0.34023 -2.398 0.016702 *
## as.numeric(internet) -3.39905
                                    1.34264 -2.532 0.011552 *
## age
                        -0.21162
                                    0.06734 -3.143 0.001739 **
## as.numeric(educ)
                         1.37533
                                    0.91905
                                             1.496 0.134945
## pidLean Democrat
                                    2.73843 -3.564 0.000388 ***
                        -9.75944
## pidIndependent
                       -36.57881
                                    2.15737 -16.955 < 2e-16 ***
## pidLean Republican
                                    2.43440 -19.841 < 2e-16 ***
                       -48.29986
## pidRepublican
                       -58.02960
                                    2.51698 -23.055 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 21.66 on 766 degrees of freedom
## Multiple R-squared: 0.5187, Adjusted R-squared: 0.5105
## F-statistic: 63.49 on 13 and 766 DF, p-value: < 2.2e-16
## on Dems
summary(lm(as.numeric(Q15_1) ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.n
##
## Call:
## lm(formula = as.numeric(Q15_1) ~ treatment + as.numeric(fb) +
      as.numeric(CB) + as.numeric(twitter) + as.numeric(internet) +
##
      age + as.numeric(educ) + pid, data = dems)
##
##
## Residuals:
     Min
             1Q Median
                           3Q
                                 Max
## -76.04 -6.43
                 2.21 11.33 34.49
##
## Coefficients:
                       Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                                 13.02586 4.637 5.46e-06 ***
                       60.39930
## treatmentDem CB
                        1.69996
                                   3.19181
                                             0.533 0.59474
## treatmentRep_non
                        1.27097
                                   3.06660
                                            0.414 0.67886
## treatmentRep CB
                       -1.33249
                                   3.06939 -0.434 0.66454
## as.numeric(fb)
                                            2.188 0.02950 *
                        1.17070
                                   0.53504
## as.numeric(CB)
                        0.26404
                                   0.80396
                                             0.328 0.74284
                                   0.47875 -0.339 0.73463
## as.numeric(twitter) -0.16245
                                   1.91643 -0.762 0.44661
## as.numeric(internet) -1.46065
## age
                        0.06843
                                   0.09874
                                             0.693 0.48889
## as.numeric(educ)
                        3.81749
                                   1.30368
                                             2.928 0.00369 **
## pidLean Democrat
                                   2.39737 -3.197 0.00155 **
                       -7.66368
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 18.51 on 277 degrees of freedom
## Multiple R-squared: 0.1003, Adjusted R-squared: 0.06783
## F-statistic: 3.088 on 10 and 277 DF, p-value: 0.0009602
```

```
## on Reps --> likes CB more, likes Dems less
summary(lm(as.numeric(Q15_1) ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.n
##
## Call:
## lm(formula = as.numeric(Q15_1) ~ treatment + as.numeric(fb) +
##
       as.numeric(CB) + as.numeric(twitter) + as.numeric(internet) +
       age + as.numeric(educ) + pid, data = reps)
##
##
## Residuals:
               10 Median
                                3Q
      Min
                                       Max
## -30.831 -14.336 -3.623
                            9.167 73.767
## Coefficients:
##
                        Estimate Std. Error t value Pr(>|t|)
                                 14.1826 5.369 1.77e-07 ***
## (Intercept)
                        76.1488
## treatmentDem_CB
                         5.0467
                                    3.5613
                                            1.417 0.157666
## treatmentRep_non
                         -1.0402
                                    3.6681 -0.284 0.776951
## treatmentRep_CB
                         -2.8115
                                    3.6244 -0.776 0.438622
## as.numeric(fb)
                         0.1666
                                    0.6443 0.259 0.796192
## as.numeric(CB)
                        -2.1562
                                    0.8709 -2.476 0.013935 *
## as.numeric(twitter)
                        -1.5767
                                    0.5630 -2.800 0.005493 **
## as.numeric(internet) -5.0587
                                    2.0706 -2.443 0.015237 *
                        -0.2829
                                    0.1066 -2.654 0.008445 **
## as.numeric(educ)
                         0.6158
                                     1.5417
                                            0.399 0.689903
## pidRepublican
                        -9.5691
                                    2.5216 -3.795 0.000184 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 20.36 on 257 degrees of freedom
## Multiple R-squared: 0.1681, Adjusted R-squared: 0.1357
## F-statistic: 5.193 on 10 and 257 DF, p-value: 6.144e-07
######3
## towards reps
######3
##general pop
summ_feelrep<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_2)),
            sd_PL = sd(as.numeric(Q15_2)),
           n_PL = n(),
            SE PL = sd(as.numeric(Q15 2))/sqrt(n()))
p1<-ggplot(summ_feelrep, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Republicans, all")
##dems
summ_feelrep_dem<-dems %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_2)),
            sd_PL = sd(as.numeric(Q15_2)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_2))/sqrt(n()))
```

```
p2<-ggplot(summ_feelrep_dem, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom point(position=pd) +ggtitle("sentiment for Republicans, Democrats")
##reps
summ_feelrep_rep<-reps %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 2)),
            sd PL = sd(as.numeric(Q15 2)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_2))/sqrt(n()))
p3<-ggplot(summ_feelrep_rep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Republicans, Republicans")
summ_feelrep_hdem<-harddems %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 2)),
            sd PL = sd(as.numeric(Q15 2)),
            n_PL = n(),
            SE PL = sd(as.numeric(Q15 2))/sqrt(n()))
p4<-ggplot(summ_feelrep_hdem, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Republicans, HardDemocrats")
##Hardreps
summ_feelrep_hrep<-hardreps %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_2)),
            sd_PL = sd(as.numeric(Q15_2)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_2))/sqrt(n()))
p5<-ggplot(summ_feelrep_hrep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom point(position=pd) +ggtitle("sentiment for Republicans, HardRepublicans")
pdf("results/feelrep.pdf", 7, 5)
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
```

```
pdf("results/feelrep_bis.pdf", 7, 5)
multiplot(p1,p2,p3,p4,p5,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
## t-tests --> significantively higher sentiment for republicans on Dems and Reps with Rep_CB (not on g
t.test(as.numeric(total$Q15_2)[total$treatment=="Rep_CB"],as.numeric(total$Q15_2)[total$treatment!="Rep_CB"]
##
## Welch Two Sample t-test
##
## data: as.numeric(total$Q15_2)[total$treatment == "Rep_CB"] and as.numeric(total$Q15_2)[total$treatm
## t = 0.53907, df = 325.93, p-value = 0.5902
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -3.662345 6.427002
## sample estimates:
## mean of x mean of y
## 41.87374 40.49141
t.test(as.numeric(dems$Q15_2)[dems$treatment=="Rep_CB"],as.numeric(dems$Q15_2)[dems$treatment!="Rep_CB"]
##
## Welch Two Sample t-test
##
## data: as.numeric(dems$Q15_2)[dems$treatment == "Rep_CB"] and as.numeric(dems$Q15_2)[dems$treatment
## t = 2.01, df = 117.1, p-value = 0.04673
\#\# alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
   0.09438844 12.72631692
## sample estimates:
## mean of x mean of y
## 27.22078 20.81043
t.test(as.numeric(reps$Q15_2)[reps$treatment=="Rep_CB"],as.numeric(reps$Q15_2)[reps$treatment!="Rep_CB"]
##
## Welch Two Sample t-test
## data: as.numeric(reps$Q15_2)[reps$treatment == "Rep_CB"] and as.numeric(reps$Q15_2)[reps$treatment
## t = 1.6092, df = 101.3, p-value = 0.1107
\#\# alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
```

```
## -1.166318 11.191999
## sample estimates:
## mean of x mean of y
  71.53226 66.51942
### regression analysis
summary(lm(as.numeric(Q15_2) ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.n
##
## Call:
## lm(formula = as.numeric(Q15_2) ~ treatment + as.numeric(fb) +
      as.numeric(CB) + as.numeric(twitter) + as.numeric(internet) +
##
      age + as.numeric(educ) + pid, data = total)
##
## Residuals:
##
      Min
              1Q Median
                             3Q
                                   Max
## -74.775 -15.992 -0.521 14.995 74.124
## Coefficients:
##
                     Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                     36.88058 9.60633 3.839 0.000134 ***
                                 2.26470 0.836 0.403251
## treatmentDem_CB
                      1.89396
## treatmentRep_non
                      -0.18064
                                 2.25022 -0.080 0.936037
## treatmentRep_CB
                      2.46092
                                 2.24489 1.096 0.273321
## as.numeric(fb)
                      0.56604 0.895 0.371127
## as.numeric(CB)
                      0.50654
## as.numeric(twitter)
                      0.11135 0.34858
                                        0.319 0.749471
## age
                      ## as.numeric(educ)
                     -0.80344
                                 0.94160 -0.853 0.393776
                     10.95817
## pidLean Democrat
                                 2.80562
                                          3.906 0.000102 ***
## pidIndependent
                                          5.887 5.87e-09 ***
                     13.01302
                                 2.21031
## pidLean Republican
                     41.53772
                                 2.49413 16.654 < 2e-16 ***
                                 2.57873 21.252 < 2e-16 ***
## pidRepublican
                      54.80430
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 22.2 on 766 degrees of freedom
## Multiple R-squared: 0.4747, Adjusted R-squared: 0.4657
## F-statistic: 53.24 on 13 and 766 DF, p-value: < 2.2e-16
## on Dems
summary(lm(as.numeric(Q15_2) ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.n
##
## Call:
## lm(formula = as.numeric(Q15_2) ~ treatment + as.numeric(fb) +
##
      as.numeric(CB) + as.numeric(twitter) + as.numeric(internet) +
##
      age + as.numeric(educ) + pid, data = dems)
##
## Residuals:
##
      Min
              1Q Median
                             3Q
                                   Max
## -39.682 -15.676 -6.764 12.548 55.099
##
## Coefficients:
##
                      Estimate Std. Error t value Pr(>|t|)
```

```
## (Intercept)
                        45.907640 15.005712
                                              3.059 0.002436 **
## treatmentDem_CB
                                              0.468 0.640174
                        1.720701
                                   3.676947
                                              0.340 0.733756
## treatmentRep non
                        1.202801
                                   3.532706
## treatmentRep_CB
                                              1.502 0.134135
                         5.312339
                                   3.535917
## as.numeric(fb)
                         1.171686
                                   0.616367
                                              1.901 0.058346
## as.numeric(CB)
                         0.504037
                                   0.926160
                                             0.544 0.586726
## as.numeric(twitter)
                         0.471282
                                   0.551518
                                              0.855 0.393557
## as.numeric(internet) -6.450152
                                   2.207720 -2.922 0.003769 **
## age
                         0.003982
                                   0.113753
                                              0.035 0.972100
## as.numeric(educ)
                        -0.697350
                                   1.501832
                                             -0.464 0.642774
## pidLean Democrat
                        10.508191
                                    2.761760
                                              3.805 0.000175 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 21.33 on 277 degrees of freedom
## Multiple R-squared: 0.1098, Adjusted R-squared: 0.07763
## F-statistic: 3.416 on 10 and 277 DF, p-value: 0.0003098
## on Reps --> likes CB more, likes Dems less
summary(lm(as.numeric(Q15_2) ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.n
##
## Call:
## lm(formula = as.numeric(Q15_2) ~ treatment + as.numeric(fb) +
       as.numeric(CB) + as.numeric(twitter) + as.numeric(internet) +
##
       age + as.numeric(educ) + pid, data = reps)
##
## Residuals:
      Min
                10 Median
                                3Q
                                       Max
## -75.967 -9.846
                    3.118 13.725 47.964
##
## Coefficients:
                        Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                        78.48494
                                 14.22282
                                             5.518 8.35e-08 ***
## treatmentDem_CB
                         2.54217
                                   3.57137
                                             0.712
                                                     0.4772
## treatmentRep_non
                        2.50993
                                   3.67845
                                             0.682
                                                     0.4956
## treatmentRep_CB
                        4.77592
                                   3.63463
                                             1.314
                                                     0.1900
## as.numeric(fb)
                         1.17073
                                   0.64614
                                             1.812
                                                     0.0712 .
## as.numeric(CB)
                        -0.11200
                                   0.87335 -0.128
                                                     0.8981
## as.numeric(twitter) -0.24794
                                   0.56464 - 0.439
                                                     0.6610
## as.numeric(internet) -2.38156
                                   2.07651 -1.147
                                                     0.2525
                        0.02569
                                   0.10689
                                             0.240
                                                      0.8102
## age
## as.numeric(educ)
                        -3.55574
                                   1.54611 -2.300
                                                      0.0223 *
## pidRepublican
                        13.04492
                                   2.52875
                                            5.159 4.98e-07 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 20.41 on 257 degrees of freedom
## Multiple R-squared: 0.1461, Adjusted R-squared: 0.1129
## F-statistic: 4.398 on 10 and 257 DF, p-value: 1.031e-05
######3
## towards online media
######3
##general pop
```

```
summ_feelonl<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 3)),
            sd_PL = sd(as.numeric(Q15_3)),
            n PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
p1<-ggplot(summ_feelonl, aes(treatment, sentiment)) +</pre>
  geom errorbar(aes(ymin=sentiment-SE PL, ymax=sentiment+SE PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Online Media, all")
##dems
summ feelonl dem<-dems %>% group by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_3)),
            sd_PL = sd(as.numeric(Q15_3)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
p2<-ggplot(summ_feelonl_dem, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Online Media, Democrats")
##reps
summ_feelonl_rep<-reps %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 3)),
            sd PL = sd(as.numeric(Q15 3)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
p3<-ggplot(summ_feelonl_rep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Online Media, Republicans")
pdf("results/feelonl.pdf", 7, 5)
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
######3
## towards traditional media
######3
##general pop
summ_feeloff<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_4)),
```

```
sd_PL = sd(as.numeric(Q15_4)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_4))/sqrt(n()))
p1<-ggplot(summ_feeloff, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom point(position=pd) +ggtitle("sentiment for Traditional Media, all")
summ_feeloff_dem<-dems %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_4)),
            sd_PL = sd(as.numeric(Q15_4)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_4))/sqrt(n()))
p2<-ggplot(summ_feeloff_dem, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Traditional Media, Democrats")
##reps
summ_feeloff_rep<-reps %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_4)),
            sd PL = sd(as.numeric(Q15 4)),
            n PL = n(),
            SE PL = sd(as.numeric(Q15 4))/sqrt(n()))
p3<-ggplot(summ_feeloff_rep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Traditional Media, Republicans")
pdf("results/feeloff.pdf", 7, 5)
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
## feeling Vs Democrats
summary(lm(Q15_1 ~ treatment + pfc +as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + age +
##
## Call:
## lm(formula = Q15_1 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) +
##
       as.numeric(internet) + age + as.numeric(educ) + pid, data = total)
##
```

```
## Residuals:
##
      Min
                1Q Median
                                30
                                       Max
                    0.981 12.897
## -76.435 -13.913
                                    78.378
## Coefficients:
##
                         Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                         99.12370
                                     9.50367 10.430 < 2e-16 ***
## treatmentDem_CB
                          2.26230
                                     2.24310
                                              1.009 0.31351
## treatmentRep_non
                         -2.46582
                                     2.21990 -1.111 0.26702
## treatmentRep_CB
                         -1.75535
                                     2.20879 -0.795 0.42703
## pfc
                         -3.80805
                                     4.13148 -0.922 0.35697
                                               2.284 0.02265 *
## as.numeric(fb)
                          0.88966
                                     0.38953
## as.numeric(twitter)
                         -0.84406
                                    0.34447
                                             -2.450 0.01450 *
## as.numeric(internet)
                         -3.52291
                                     1.35238
                                             -2.605 0.00937 **
                                             -3.280 0.00109 **
## age
                         -0.21915
                                     0.06681
## as.numeric(educ)
                          1.54655
                                     0.92960
                                               1.664
                                                      0.09659 .
                                     2.76444 -3.283 0.00108 **
## pidLean Democrat
                         -9.07489
## pidIndependent
                                     2.17679 -16.744 < 2e-16 ***
                        -36.44817
## pidLean Republican
                                     2.47217 -19.511 < 2e-16 ***
                        -48.23432
## pidRepublican
                        -57.84022
                                     2.53682 -22.800 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 21.74 on 754 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.5196, Adjusted R-squared: 0.5113
## F-statistic: 62.72 on 13 and 754 DF, p-value: < 2.2e-16
## feeling Vs Rep
## republican news with no CB decreases sentiment against Rep (people who chose many CB news like Reps
summary(lm(Q15_2 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + age
##
## Call:
## lm(formula = Q15_2 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) +
##
       as.numeric(internet) + age + as.numeric(educ) + pid, data = total)
##
## Residuals:
      Min
##
                1Q Median
                                3Q
                                       Max
## -75.757 -15.995 -0.822 15.089
                                    72.873
##
## Coefficients:
                        Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                        35.92764
                                    9.71670
                                              3.698 0.000234 ***
                                              0.842 0.400138
## treatmentDem_CB
                         1.93069
                                    2.29338
                                    2.26966 -0.110 0.912425
## treatmentRep_non
                        -0.24970
## treatmentRep_CB
                         2.19308
                                    2.25830
                                              0.971 0.331801
## pfc
                         7.74554
                                    4.22409
                                              1.834 0.067099
## as.numeric(fb)
                                              3.737 0.000201 ***
                         1.48814
                                    0.39826
## as.numeric(twitter)
                         0.07232
                                    0.35220
                                              0.205 0.837351
## as.numeric(internet) -4.89058
                                    1.38270 -3.537 0.000429 ***
## age
                         0.01205
                                    0.06831
                                              0.176 0.859998
## as.numeric(educ)
                        -0.75273
                                    0.95044 -0.792 0.428619
## pidLean Democrat
                        11.49818
                                    2.82640
                                              4.068 5.24e-05 ***
## pidIndependent
                        13.03736
                                    2.22559
                                            5.858 7.00e-09 ***
```

```
## pidLean Republican
                       41.09668
                                   2.52759 16.259 < 2e-16 ***
                                   2.59369 21.125 < 2e-16 ***
## pidRepublican
                       54.79139
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 22.22 on 754 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.4751, Adjusted R-squared: 0.4661
## F-statistic: 52.5 on 13 and 754 DF, p-value: < 2.2e-16
## feeling towards online and traditional media (Republicans dislike traditional media but not online)
summary(lm(Q15_3 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + age
##
## Call:
## lm(formula = Q15_3 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) +
       as.numeric(internet) + age + as.numeric(educ) + pid, data = total)
##
## Residuals:
      Min
                1Q Median
                                3Q
                                       Max
## -54.167 -16.890
                    1.862 17.068 61.119
##
## Coefficients:
##
                        Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                        57.84048
                                   10.23481
                                              5.651 2.26e-08 ***
                                             -0.724 0.469452
## treatmentDem_CB
                        -1.74831
                                     2.41567
## treatmentRep non
                        -2.89766
                                    2.39068 -1.212 0.225867
## treatmentRep CB
                        -2.95705
                                    2.37872 -1.243 0.214208
## pfc
                         7.11255
                                    4.44933
                                             1.599 0.110335
## as.numeric(fb)
                         0.50444
                                     0.41950
                                              1.202 0.229561
## as.numeric(twitter)
                                    0.37097
                                              2.454 0.014348 *
                         0.91042
## as.numeric(internet) -0.56672
                                    1.45642 -0.389 0.697301
## age
                        -0.19406
                                    0.07195 -2.697 0.007152 **
## as.numeric(educ)
                        -0.30429
                                    1.00112 -0.304 0.761247
## pidLean Democrat
                        -5.15656
                                    2.97711 -1.732 0.083671 .
## pidIndependent
                                    2.34426 -3.475 0.000539 ***
                        -8.14719
## pidLean Republican
                                     2.66237 -3.921 9.64e-05 ***
                       -10.43805
## pidRepublican
                        -8.44435
                                     2.73199 -3.091 0.002069 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 23.41 on 754 degrees of freedom
     (12 observations deleted due to missingness)
## Multiple R-squared: 0.05769,
                                   Adjusted R-squared: 0.04144
## F-statistic: 3.551 on 13 and 754 DF, p-value: 1.992e-05
summary(lm(Q15_4 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) + as.numeric(internet) + age
##
## lm(formula = Q15_4 ~ treatment + pfc + as.numeric(fb) + as.numeric(twitter) +
##
       as.numeric(internet) + age + as.numeric(educ) + pid, data = total)
##
## Residuals:
##
      Min
                1Q Median
                                3Q
                                      Max
```

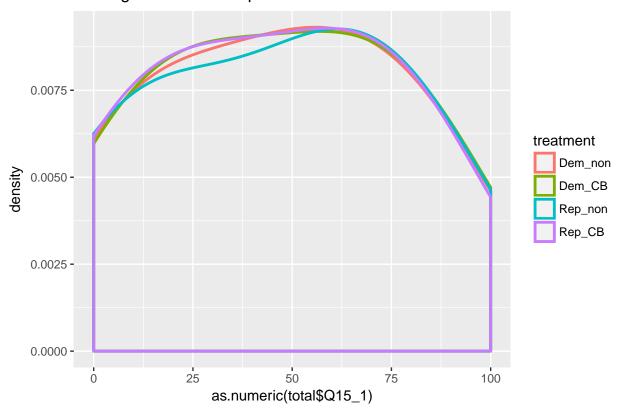
```
##
                        Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                       72.31519 11.17017
                                            6.474 1.72e-10 ***
                                   2.63643 -0.799 0.42439
## treatmentDem CB
                       -2.10719
## treatmentRep non
                       -1.39846
                                   2.60916 -0.536 0.59213
                                   2.59611 -0.787 0.43176
## treatmentRep_CB
                       -2.04213
## pfc
                        -0.81895
                                   4.85595 -0.169 0.86612
## as.numeric(fb)
                                           2.592 0.00974 **
                        1.18649
                                   0.45784
## as.numeric(twitter)
                       -0.30168
                                   0.40488 -0.745 0.45643
                                   1.58953 -2.558 0.01073 *
## as.numeric(internet) -4.06543
                                  0.07853 -1.137 0.25610
## age
                       -0.08925
## as.numeric(educ)
                                           3.189 0.00149 **
                        3.48402
                                   1.09261
## pidLean Democrat
                       -6.53928
                                   3.24919 -2.013 0.04451 *
## pidIndependent
                       -22.35146
                                   2.55850 -8.736 < 2e-16 ***
## pidLean Republican
                      -19.98467
                                   2.90568 -6.878 1.28e-11 ***
## pidRepublican
                       -27.86474
                                   2.98166 -9.345 < 2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 25.55 on 754 degrees of freedom
    (12 observations deleted due to missingness)
## Multiple R-squared: 0.1769, Adjusted R-squared: 0.1627
## F-statistic: 12.46 on 13 and 754 DF, p-value: < 2.2e-16
ggplot(total,aes(x=as.numeric(total$Q15_1), colour=treatment)) + geom_density(adjust=2.1,size=1) +ggtit
```

-63.955 -21.738 0.438 19.452 61.414

##

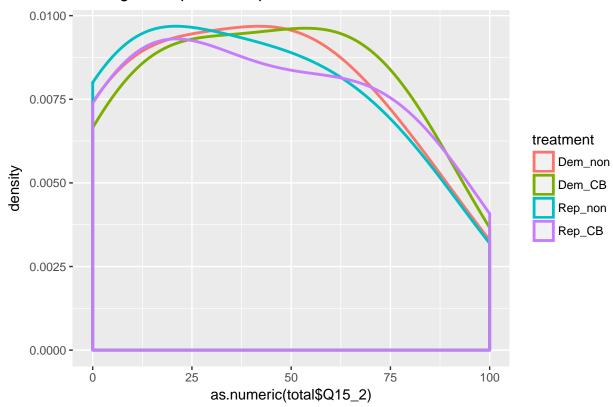
Coefficients:

Feeling for Democrats per treatment



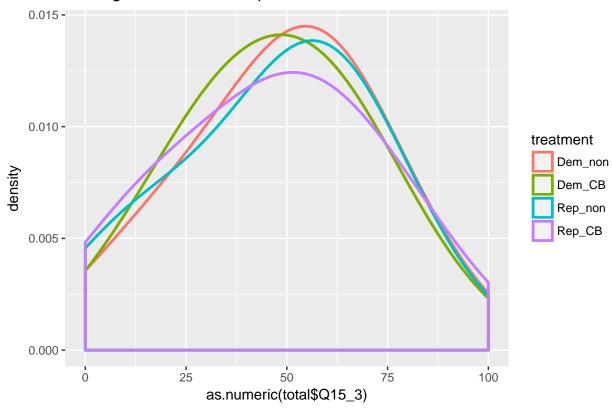
 ${\tt ggplot(total,aes(x=as.numeric(total\$Q15_2),\ colour=treatment)) + geom_density(adjust=2.1,size=1) + ggtited (adjust=2.1,size=1) + ggtited (adjust=2.1,s$

Feeling for Republicans per treatment



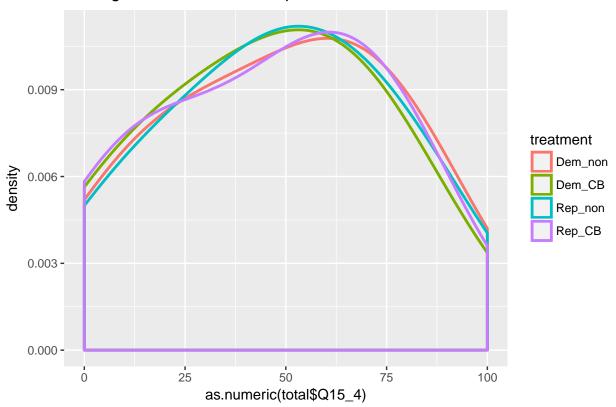
ggplot(total,aes(x=as.numeric(total\$Q15_3), colour=treatment)) + geom_density(adjust=2.1,size=1) +ggtit

Feeling for Online media per treatment



ggplot(total,aes(x=as.numeric(total\$Q15_4), colour=treatment)) + geom_density(adjust=2.1,size=1) +ggtit

Feeling for Traditional Media per treatment



```
##working on the correct answers
total$correct<-0
total$correct1<-0
total$correct2<-0
total$correct3<-0
total$correct[total$QID34=="The House of Representatives"]<-1</pre>
total$correct[total$QID35=="lead to more than 5 million Americans who are currently insured to lose the
total$correct[total$Q36=="provide Americans more choice, greater control and lower costs"]<-1+total$cor.
total$correct1[total$QID34=="The House of Representatives"]<-1</pre>
total$correct2[total$QID35=="lead to more than 5 million Americans who are currently insured to lose th
total$correct3[total$Q36=="provide Americans more choice, greater control and lower costs"]<-1
dems<-filter(total, pid == "Democrat" | pid == "Lean Democrat")</pre>
reps<-filter(total, pid == "Republican" | pid == "Lean Republican")</pre>
inds<-filter(total, pid == "Independent")</pre>
##general population
summ_correct_gen<-total %>% group_by(treatment) %>%
  summarise(shareCorrect = mean(correct),
            sd_PL = sd(correct),
            n_PL = n(),
            SE_PL = sd(correct)/sqrt(n()))
```

```
p1<-ggplot(summ_correct_gen, aes(treatment, shareCorrect)) +</pre>
  geom_errorbar(aes(ymin=shareCorrect-SE_PL, ymax=shareCorrect+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom point(position=pd) +ggtitle("% of correct answers, all")
##dems
summ correct dem<-dems %>% group by(treatment) %>%
  summarise(shareCorrect = mean(correct),
            sd_PL = sd(correct),
            n_PL = n(),
            SE_PL = sd(correct)/sqrt(n()))
p2<-ggplot(summ_correct_dem, aes(treatment, shareCorrect)) +</pre>
  geom_errorbar(aes(ymin=shareCorrect-SE_PL, ymax=shareCorrect+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("% of correct answers, Democrats")
##reps
summ_correct_rep<-reps %>% group_by(treatment) %>%
  summarise(shareCorrect = mean(correct),
            sd_PL = sd(correct),
            n PL = n(),
            SE_PL = sd(correct)/sqrt(n()))
p3<-ggplot(summ_correct_rep, aes(treatment, shareCorrect)) +
  geom_errorbar(aes(ymin=shareCorrect-SE_PL, ymax=shareCorrect+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("% of correct answers, Republicans")
pdf("results/correct.pdf", 7, 5)
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
###by question
##general population
summ_correct3_gen<-total %>% group_by(treatment) %>%
  summarise(shareCorrect = mean(correct3),
            sd_PL = sd(correct3),
            n_PL = n(),
            SE_PL = sd(correct3)/sqrt(n()))
p1<-ggplot(summ_correct3_gen, aes(treatment, shareCorrect)) +
geom_errorbar(aes(ymin=shareCorrect-SE_PL, ymax=shareCorrect+SE_PL), width=.1, position=pd) +
```

```
geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("% of correct answers, all")
##dems
summ_correct3_dem<-dems %>% group_by(treatment) %>%
  summarise(shareCorrect = mean(correct3),
            sd PL = sd(correct3),
            n PL = n(),
            SE PL = sd(correct3)/sqrt(n()))
p2<-ggplot(summ_correct3_dem, aes(treatment, shareCorrect)) +</pre>
  geom errorbar(aes(ymin=shareCorrect-SE PL, ymax=shareCorrect+SE PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("% of correct answers, Democrats")
##reps
summ_correct3_rep<-reps %>% group_by(treatment) %>%
  summarise(shareCorrect = mean(correct3),
            sd_PL = sd(correct3),
            n_PL = n(),
            SE_PL = sd(correct3)/sqrt(n()))
p3<-ggplot(summ_correct3_rep, aes(treatment, shareCorrect)) +
  geom errorbar(aes(ymin=shareCorrect-SE PL, ymax=shareCorrect+SE PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("% of correct answers, Republicans")
pdf("results/correct3.pdf", 7, 5)
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
### t-tests --> Democratic non CB is significantly higher that other treatments
t.test(total$correct[total$treatment=="Dem_non"],total$correct[total$treatment!="Dem_non"])
##
## Welch Two Sample t-test
##
## data: total$correct[total$treatment == "Dem_non"] and total$correct[total$treatment != "Dem_non"]
## t = 2.4339, df = 367.48, p-value = 0.01541
\#\# alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.02804202 0.26395007
## sample estimates:
```

```
## mean of x mean of y
## 2.585859 2.439863
### this is true for Republican voters only
t.test(dems$correct[dems$treatment=="Dem_non"],dems$correct[dems$treatment!="Dem_non"])
## Welch Two Sample t-test
##
## data: dems$correct[dems$treatment == "Dem_non"] and dems$correct[dems$treatment != "Dem_non"]
## t = 1.4919, df = 152.06, p-value = 0.1378
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.04463318 0.31988007
## sample estimates:
## mean of x mean of y
## 2.602740 2.465116
t.test(reps$correct[reps$treatment=="Dem_non"],reps$correct[reps$treatment!="Dem_non"])
##
## Welch Two Sample t-test
##
## data: reps$correct[reps$treatment == "Dem_non"] and reps$correct[reps$treatment != "Dem_non"]
## t = 2.447, df = 149.01, p-value = 0.01557
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.04321509 0.40584696
## sample estimates:
## mean of x mean of y
## 2.628571 2.404040
##create filter for those who made >2 mistakes
bad<-filter(total, correct<2)</pre>
good<-filter(total, correct>1)
##re-run t-tests on "good" population only --> not a big change for sentiment
## pro-dem sentiment with dem_CB on whole pop, dem pop or rep pop
t.test(as.numeric(good$Q15_1)[good$treatment=="Dem_CB"],as.numeric(good$Q15_1)[good$treatment!="Dem_CB"]
##
## Welch Two Sample t-test
##
## data: as.numeric(good$Q15_1)[good$treatment == "Dem_CB"] and as.numeric(good$Q15_1)[good$treatment
## t = 0.73505, df = 280.53, p-value = 0.4629
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -3.378840 7.406063
## sample estimates:
## mean of x mean of y
## 46.55488 44.54127
t.test(as.numeric(good$Q15_1)[good$treatment=="Dem_CB" & (good$pid=="Democrat" | good$pid=="Lean Democr
##
##
   Welch Two Sample t-test
##
```

```
## data: as.numeric(good$Q15_1)[good$treatment == "Dem_CB" & (good$pid == and as.numeric(good$Q15_1)[
## t = 0.78991, df = 102.8, p-value = 0.4314
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -3.264975 7.587173
## sample estimates:
## mean of x mean of y
## 74.55172 72.39062
t.test(as.numeric(good$Q15_1)[good$treatment=="Dem_CB" & (good$pid=="Republican" | good$pid=="Lean Repu
##
## Welch Two Sample t-test
##
## data: as.numeric(good$Q15_1)[good$treatment == "Dem_CB" & (good$pid == and as.numeric(good$Q15_1)[
## t = 1.813, df = 126.65, p-value = 0.0722
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -0.4765145 10.8938874
## sample estimates:
## mean of x mean of y
## 25.93750 20.72881
## same for pro-rep with Rep_CB
t.test(as.numeric(good$Q15_2)[good$treatment=="Rep_CB"],as.numeric(good$Q15_2)[good$treatment!="Rep_CB"]
##
## Welch Two Sample t-test
## data: as.numeric(good$Q15_2)[good$treatment == "Rep_CB"] and as.numeric(good$Q15_2)[good$treatment
## t = 0.97541, df = 279.88, p-value = 0.3302
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -2.740666 8.124523
## sample estimates:
## mean of x mean of y
## 41.68023 38.98830
t.test(as.numeric(good$Q15_2)[good$treatment=="Rep_CB" & (good$pid=="Democrat" | good$pid=="Lean Democr
##
## Welch Two Sample t-test
##
## data: as.numeric(good$Q15_2)[good$treatment == "Rep_CB" & (good$pid == and as.numeric(good$Q15_2)[
## t = 2.0211, df = 94.649, p-value = 0.0461
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
   0.1215037 13.6231949
## sample estimates:
## mean of x mean of y
## 26.26154 19.38919
t.test(as.numeric(good$Q15_2)[good$treatment=="Rep_CB" & (good$pid=="Republican" | good$pid=="Lean Repu
##
## Welch Two Sample t-test
##
```

```
## data: as.numeric(good$Q15_2)[good$treatment == "Rep_CB" & (good$pid == and as.numeric(good$Q15_2)[
## t = 1.3966, df = 89.722, p-value = 0.166
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -1.981518 11.360862
## sample estimates:
## mean of x mean of y
## 70.44643 65.75676
##create filter for quick replies
summary(as.numeric(total$Q43_Page.Submit))
     Min. 1st Qu. Median
##
                              Mean 3rd Qu.
                                              Max.
##
     8.397
           9.439 11.430 14.256 15.865 103.895
summary(as.numeric(total$Q46_Page.Submit))
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
##
            9.943 13.465 16.250 18.602 191.246
summary(as.numeric(total$Q45_Page.Submit))
     Min. 1st Qu. Median
                              Mean 3rd Qu.
            9.393 11.236 14.213 14.997 405.992
     8.437
##
## working on % of CB chosen in phase 1
HighCB<-filter(total, CB>4)
LowCB<-filter(total, CB<2)
################
#### feelings analysis
######3
## towards Dem
######3
##general pop
###No specific effect on people who like more CB
summ_feeldem<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
           sd_PL = sd(as.numeric(Q15_1)),
           n_PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
##HighCB
summ_feeldem_highCB<-HighCB %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
           sd_PL = sd(as.numeric(Q15_1)),
            n_PL = n(),
            SE PL = sd(as.numeric(Q15 1))/sqrt(n()))
##LowCB
summ_feeldem_lowCB<-LowCB %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_1)),
           sd_PL = sd(as.numeric(Q15_1)),
           n PL = n(),
            SE_PL = sd(as.numeric(Q15_1))/sqrt(n()))
```

```
pdf("results/feeldem_CBlikelihood.pdf", 7, 5)
p1<-ggplot(summ feeldem, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, all")
p2<-ggplot(summ_feeldem_highCB, aes(treatment, sentiment)) +</pre>
  geom errorbar(aes(ymin=sentiment-SE PL, ymax=sentiment+SE PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom point(position=pd) +ggtitle("sentiment for Democrats, HighCB")
p3<-ggplot(summ_feeldem_lowCB, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Democrats, LowCB")
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
######
##towards Reps
#####
summ feelrep<-total %>% group by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_2)),
            sd PL = sd(as.numeric(Q15 2)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_2))/sqrt(n()))
summ_feelrep_highCB<-HighCB %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_2)),
            sd_PL = sd(as.numeric(Q15_2)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_2))/sqrt(n()))
summ_feelrep_lowCB<-LowCB %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 2)),
            sd_PL = sd(as.numeric(Q15_2)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_2))/sqrt(n()))
pdf("results/feelrep_CBlikelihood.pdf", 7, 5)
p1<-ggplot(summ feelrep, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
```

```
geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Republicans, all")
p2<-ggplot(summ_feelrep_highCB, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Republicans, HighCB")
p3<-ggplot(summ_feelrep_lowCB, aes(treatment, sentiment)) +
  geom errorbar(aes(ymin=sentiment-SE PL, ymax=sentiment+SE PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Republicans, LowCB")
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
######3
## towards online media
######3
##general pop
summ_feelonl<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 3)),
            sd_PL = sd(as.numeric(Q15_3)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
p1<-ggplot(summ feelonl, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Online Media, all")
##high CB
summ_feelonl_highCB<-HighCB %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15_3)),
            sd_PL = sd(as.numeric(Q15_3)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
p2<-ggplot(summ_feelonl_highCB, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Online Media, High CB")
##low CB
summ_feelonl_lowCB<-LowCB %>% group_by(treatment) %>%
  summarise(sentiment = mean(as.numeric(Q15 3)),
            sd_PL = sd(as.numeric(Q15_3)),
```

```
n_PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
p3<-ggplot(summ_feelonl_lowCB, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom line(position=pd) +
  geom_point(position=pd) +ggtitle("sentiment for Online Media, Low CB")
pdf("results/feelonl CBlikelihood.pdf", 7, 5)
multiplot(p1,p2,p3,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
summ feelonlCB<-total %>% group by(CB) %>%
  summarise(sentiment = mean(as.numeric(Q15_3)),
            sd_PL = sd(as.numeric(Q15_3)),
            n_PL = n(),
            SE_PL = sd(as.numeric(Q15_3))/sqrt(n()))
## nothing appears when we compare people by level of selected CB
p1<-ggplot(summ_feelonlCB, aes(CB, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
 geom_point(position=pd) +ggtitle("sentiment for Online Media by #of CB selected")
pdf("results/feelonl byCB.pdf", 7, 5)
multiplot(p1)
dev.off()
## pdf
##
### analysis of difference in-party out-party
total$diffDR<-as.numeric(total$Q15_1)-as.numeric(total$Q15_2)</pre>
dems<-filter(total, pid == "Democrat" | pid == "Lean Democrat")</pre>
reps<-filter(total, pid == "Republican" | pid == "Lean Republican")</pre>
inds<-filter(total, pid == "Independent")</pre>
summ_feeldiffDR<-total %>% group_by(treatment) %>%
  summarise(sentiment = mean(diffDR),
            sd_PL = sd(diffDR),
            n_PL = n(),
            SE_PL = sd(diffDR)/sqrt(n()))
summ_feeldiffDR_dems<-dems %>% group_by(treatment) %>%
  summarise(sentiment = mean(diffDR),
            sd_PL = sd(diffDR),
            n_PL = n(),
            SE_PL = sd(diffDR)/sqrt(n()))
```

```
summ_feeldiffDR_reps<-reps %>% group_by(treatment) %>%
  summarise(sentiment = mean(diffDR),
            sd_PL = sd(diffDR),
            n PL = n()
            SE_PL = sd(diffDR)/sqrt(n()))
summ_feeldiffDR_inds<-inds %>% group_by(treatment) %>%
  summarise(sentiment = mean(diffDR),
            sd PL = sd(diffDR),
            n_PL = n(),
            SE PL = sd(diffDR)/sqrt(n()))
p1<-ggplot(summ_feeldiffDR, aes(treatment, sentiment)) +</pre>
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("Difference in sentiment Dem-Rep, all")
p2<-ggplot(summ_feeldiffDR_dems, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("Difference in sentiment Dem-Rep, Democrats")
p3<-ggplot(summ_feeldiffDR_reps, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom point(position=pd) +ggtitle("Difference in sentiment Dem-Rep, Republicans")
p4<-ggplot(summ_feeldiffDR_inds, aes(treatment, sentiment)) +
  geom_errorbar(aes(ymin=sentiment-SE_PL, ymax=sentiment+SE_PL), width=.1, position=pd) +
  geom_line(position=pd) +
  geom_point(position=pd) +ggtitle("Difference in sentiment Dem-Rep, Independents")
pdf("results/feelDiffDR.pdf", 7, 5)
multiplot(p1,p2,p3,p4,cols=2)
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
## geom_path: Each group consists of only one observation. Do you need to
## adjust the group aesthetic?
dev.off()
## pdf
##
## t-test DemCB Vs All --> non significant
t.test(as.numeric(total$diffDR)[total$treatment=="Dem_CB"],as.numeric(total$diffDR)[total$treatment!="D
##
## Welch Two Sample t-test
##
## data: as.numeric(total$diffDR)[total$treatment == "Dem_CB"] and as.numeric(total$diffDR)[total$trea
```

```
## t = -0.58772, df = 315.35, p-value = 0.5571
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -10.77507
               5.81842
## sample estimates:
## mean of x mean of y
## 3.589474 6.067797
t.test(as.numeric(dems$diffDR)[dems$treatment=="Dem_CB"],as.numeric(dems$diffDR)[dems$treatment!="Dem_C
## Welch Two Sample t-test
##
## data: as.numeric(dems$diffDR)[dems$treatment == "Dem_CB"] and as.numeric(dems$diffDR)[dems$treatmen
## t = 1.1659, df = 101.67, p-value = 0.2464
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -3.491063 13.446420
## sample estimates:
## mean of x mean of y
## 54.40625 49.42857
t.test(as.numeric(reps$diffDR)[reps$treatment=="Dem_CB"],as.numeric(reps$diffDR)[reps$treatment!="Dem_C
##
## Welch Two Sample t-test
##
## data: as.numeric(reps$diffDR)[reps$treatment == "Dem_CB"] and as.numeric(reps$diffDR)[reps$treatmen
## t = 1.1946, df = 138.1, p-value = 0.2343
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -3.165562 12.827738
## sample estimates:
## mean of x mean of y
## -41.20000 -46.03109
##t-test DemCB Vs RepCB --> highly significant for Dem and Rep responders (not for general population/i
t.test(as.numeric(total$diffDR)[total$treatment=="Dem_CB"],as.numeric(total$diffDR)[total$treatment=="R
##
## Welch Two Sample t-test
## data: as.numeric(total$diffDR)[total$treatment == "Dem_CB"] and as.numeric(total$diffDR)[total$trea
## t = -0.068335, df = 384.85, p-value = 0.9456
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## -10.41791
               9.71807
## sample estimates:
## mean of x mean of y
## 3.589474 3.939394
t.test(as.numeric(dems$diffDR)[dems$treatment=="Dem_CB"],as.numeric(dems$diffDR)[dems$treatment=="Rep_C
##
##
  Welch Two Sample t-test
##
## data: as.numeric(dems$diffDR)[dems$treatment == "Dem_CB"] and as.numeric(dems$diffDR)[dems$treatmen
```

```
## t = 2.2467, df = 135.6, p-value = 0.02628
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
     1.389285 21.812826
## sample estimates:
## mean of x mean of y
## 54.40625 42.80519
t.test(as.numeric(reps$diffDR)[reps$treatment=="Dem_CB"],as.numeric(reps$diffDR)[reps$treatment=="Rep_C"
##
  Welch Two Sample t-test
## data: as.numeric(reps$diffDR)[reps$treatment == "Dem_CB"] and as.numeric(reps$diffDR)[reps$treatmen
## t = 2.0448, df = 131.3, p-value = 0.04287
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
    0.3330843 20.1056254
## sample estimates:
## mean of x mean of y
## -41.20000 -51.41935
### regression analysis
summary(lm(diffDR ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.numeric(inte
## Call:
## lm(formula = diffDR ~ treatment + as.numeric(fb) + as.numeric(CB) +
       as.numeric(twitter) + as.numeric(internet) + age + as.numeric(educ) +
##
       pid, data = total)
##
## Residuals:
       Min
                  1Q
                      Median
                                    3Q
                                            Max
## -109.294 -17.029
                      -2.504
                               19.645
                                         91.701
##
## Coefficients:
##
                          Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                     12.27968
                                               5.016 6.58e-07 ***
                          61.58967
## treatmentDem_CB
                          0.08044
                                      2.89495
                                               0.028 0.97784
## treatmentRep_non
                          -1.98969
                                      2.87644 -0.692 0.48932
## treatmentRep_CB
                          -3.99873
                                      2.86962 -1.393 0.16388
## as.numeric(fb)
                          -0.64498
                                     0.50379 -1.280 0.20085
## as.numeric(CB)
                          -1.05561
                                     0.72356 - 1.459 0.14500
## as.numeric(twitter)
                          -0.92739
                                     0.44558 -2.081 0.03774 *
## as.numeric(internet)
                          1.40959
                                     1.75839
                                              0.802 0.42301
## age
                          -0.22961
                                     0.08819 -2.603 0.00941 **
## as.numeric(educ)
                          2.17877
                                      1.20364
                                               1.810 0.07066 .
                                      3.58640 -5.777 1.11e-08 ***
## pidLean Democrat
                         -20.71761
## pidIndependent
                        -49.59183
                                     2.82541 -17.552 < 2e-16 ***
## pidLean Republican
                        -89.83758
                                     3.18823 -28.178 < 2e-16 ***
## pidRepublican
                        -112.83389
                                     3.29637 -34.230 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
\#\# Residual standard error: 28.37 on 766 degrees of freedom
```

```
## Multiple R-squared: 0.6847, Adjusted R-squared: 0.6794
                 128 on 13 and 766 DF, p-value: < 2.2e-16
## F-statistic:
summary(lm(diffDR ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.numeric(inte
## Call:
## lm(formula = diffDR ~ treatment + as.numeric(fb) + as.numeric(CB) +
       as.numeric(twitter) + as.numeric(internet) + age + as.numeric(educ) +
##
       pid, data = dems)
##
## Residuals:
       Min
                  1Q
                       Median
                                    3Q
                                            Max
## -114.340 -16.868
                        2.021
                                         70.762
                                21.592
## Coefficients:
##
                          Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                         14.491661 20.041867
                                                0.723
                                                        0.4702
## treatmentDem_CB
                         -0.020739
                                     4.910989 -0.004
                                                        0.9966
## treatmentRep_non
                          0.068172
                                     4.718338
                                               0.014
                                                        0.9885
## treatmentRep_CB
                                     4.722627 -1.407
                         -6.644832
                                                        0.1605
## as.numeric(fb)
                         -0.000989
                                     0.823229 -0.001
                                                        0.9990
## as.numeric(CB)
                         -0.239997
                                     1.236994 -0.194
                                                        0.8463
## as.numeric(twitter)
                         -0.633727
                                     0.736616 -0.860
                                                        0.3904
## as.numeric(internet)
                                               1.692
                          4.989503
                                     2.948665
                                                        0.0917 .
                          0.064448
                                     0.151931
                                                0.424
                                                        0.6718
## age
## as.numeric(educ)
                                               2.251
                                                        0.0252 *
                          4.514842
                                     2.005870
## pidLean Democrat
                        -18.171876
                                     3.688650 -4.926 1.44e-06 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 28.49 on 277 degrees of freedom
## Multiple R-squared: 0.1365, Adjusted R-squared: 0.1054
## F-statistic: 4.38 on 10 and 277 DF, p-value: 1.023e-05
## on Reps
summary(lm(diffDR ~ treatment + as.numeric(fb) + as.numeric(CB) + as.numeric(twitter) + as.numeric(inte
##
## Call:
## lm(formula = diffDR ~ treatment + as.numeric(fb) + as.numeric(CB) +
       as.numeric(twitter) + as.numeric(internet) + age + as.numeric(educ) +
##
      pid, data = reps)
##
## Residuals:
                1Q Median
## -53.161 -20.121 -1.132 17.910 78.587
## Coefficients:
                        Estimate Std. Error t value Pr(>|t|)
                                    18.7986 -0.124
## (Intercept)
                         -2.3362
                                                      0.9012
## treatmentDem_CB
                          2.5045
                                                      0.5962
                                     4.7203
                                              0.531
## treatmentRep_non
                         -3.5502
                                     4.8619 -0.730
                                                      0.4659
## treatmentRep_CB
                                     4.8040 -1.579
                         -7.5874
                                                      0.1155
## as.numeric(fb)
                                     0.8540 -1.176
                         -1.0041
                                                      0.2408
```

```
-2.0442
## as.numeric(CB)
                                  1.1543 -1.771
                                                  0.0778 .
## as.numeric(twitter) -1.3288
                                  0.7463 -1.780 0.0762 .
## as.numeric(internet) -2.6772
                                  2.7446 -0.975
                                                   0.3303
## age
                       -0.3086
                                  0.1413 -2.184
                                                   0.0298 *
## as.numeric(educ)
                        4.1716
                                  2.0435
                                          2.041
                                                  0.0422 *
## pidRepublican
                      -22.6141
                                  3.3423 -6.766 8.9e-11 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 26.98 on 257 degrees of freedom
## Multiple R-squared: 0.2261, Adjusted R-squared: 0.196
## F-statistic: 7.507 on 10 and 257 DF, p-value: 1.78e-10
```