W241 Final Project

The Effects of Sexually Explicit Music on Self Esteem

Experiments and Causality
April 14, 2018

Load Packages and Data

```
library(XLConnect) # Used to connect to Excel
library(stargazer)

df <- readWorksheetFromFile("./Results/w241 Final Project_April 7, 2018_09.57.xlsx", sheet="LoadIntoR")
nrow(df)
## [1] 160</pre>
```

Exploratory Analysis

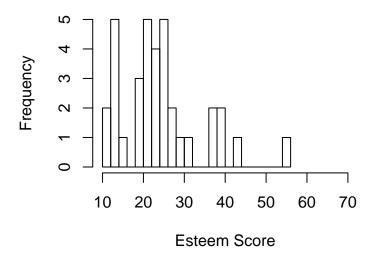
Create a dataframe with only the results from the treatment and control groups. Remove people who did not finish, or who were under 18 since these people were not given the study. Note: Highest possible esteem score (most esteem) = 10. Lowest possible esteem score (least esteem) = 70. The distributions of results are interesting. I suspect if we had more observations we would potentially see normal distributions centered around esteem score 23, but also with a large spike around the lowest score (highest esteem) of 10, which reflects a spike of people who have an overall high self esteem.

```
results = df[df$TreatControl %in% c('Treatment','Control - Music','Control - No Music'), ]
nrow(results)
## [1] 127
# Convert esteem score from character to numeric
results$EsteemScore = as.numeric(results$EsteemScore)
summary(results)
```

```
##
      StartDate
                                    IPAddress
                                                         Finished
           :2018-03-14 20:10:53
                                   Length: 127
##
                                                       Length: 127
##
   1st Qu.:2018-03-27 17:36:04
                                   Class : character
                                                       Class : character
  Median :2018-03-27 23:23:18
                                   Mode :character
                                                       Mode :character
## Mean
           :2018-03-28 12:14:33
    3rd Qu.:2018-03-29 18:05:16
##
##
   {\tt Max.}
           :2018-04-05 14:27:30
##
    ResponseID
                       LocationLatitude
                                            LocationLongitude
##
   Length: 127
                        Length: 127
                                            Length: 127
##
   Class :character
                        Class : character
                                            Class : character
##
   Mode :character
                       Mode :character
                                            Mode : character
##
##
##
##
        Age
                           Gender
                                             HeardSong
```

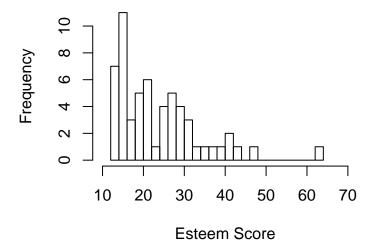
```
Length: 127
                       Length: 127
                                           Length: 127
##
    Class :character
                       Class :character
                                           Class :character
                       Mode :character
##
    Mode :character
                                           Mode :character
##
##
##
##
      LikeSong
                       TreatControl
                                            EsteemScore
                                                  :10.00
    Length: 127
                       Length: 127
                                           Min.
##
##
    Class :character
                       Class :character
                                           1st Qu.:16.00
##
    Mode :character
                       Mode :character
                                           Median :22.00
##
                                           Mean
                                                  :23.94
##
                                           3rd Qu.:28.00
##
                                           Max.
                                                  :64.00
hist(results$EsteemScore[results$TreatControl == 'Treatment'], breaks=20,
     main="Results: Treatment", xlab="Esteem Score", xlim=c(10,70))
```

Results: Treatment



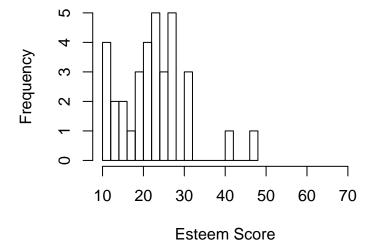
```
hist(results$EsteemScore[results$TreatControl == 'Control - Music'], breaks=20,
    main="Results: Control (Music)", xlab="Esteem Score", xlim=c(10,70))
```

Results: Control (Music)



```
hist(results$EsteemScore[results$TreatControl == 'Control - No Music'], breaks=20,
    main="Results: Control (No Music)", xlab="Esteem Score", xlim=c(10,70))
```

Results: Control (No Music)



Models: Overall

Both of the models below show that our treatment group had lower self esteem (higher score) than both control groups, but the results were not statistically significant. The score of the treatment group is 0.6 larger than the control group with music, and 2.1 larger than the control group with no music.

We included a control group with no music, so we could attempt to ensure that our control song did not have

some type of effect. We did not see a statistically significant difference in the average esteem scores of each control group, and will therefore conclude that our treatment song did not have an effect.

```
# Create new field that contains 1 for treatment and 0 for control groups
results$treat[results$TreatControl == 'Treatment'] <- 1</pre>
results$treat[results$TreatControl == 'Control - Music'] <- 0
results$treat[results$TreatControl == 'Control - No Music'] <- 0
# Model 1: Treatment vs. Control (Music)
m1 <- lm(EsteemScore ~ treat, data=results[results$TreatControl %in% c('Treatment', 'Control - Music'),
summary(m1)
##
## Call:
## lm(formula = EsteemScore ~ treat, data = results[results$TreatControl %in%
       c("Treatment", "Control - Music"), ])
##
## Residuals:
##
      Min
               1Q Median
                               3Q
                                      Max
## -13.771 -8.172 -2.172
                           4.828 39.828
##
## Coefficients:
##
              Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                24.172
                            1.339 18.046
                                            <2e-16 ***
## treat
                 0.599
                            2.183
                                   0.274
                                             0.784
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.2 on 91 degrees of freedom
## Multiple R-squared: 0.0008263, Adjusted R-squared: -0.01015
## F-statistic: 0.07526 on 1 and 91 DF, p-value: 0.7844
# Model 2: Treatment vs. Control (No Music)
m2 <- lm(EsteemScore ~ treat, data=results[results$TreatControl %in% c('Treatment', 'Control - No Music'
summary(m2)
##
## Call:
## lm(formula = EsteemScore ~ treat, data = results[results$TreatControl %in%
##
       c("Treatment", "Control - No Music"), ])
##
## Residuals:
                 1Q Median
                                   3Q
## -13.7714 -5.7714 -0.7714 4.2941 30.2286
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
                22.706
                            1.568 14.485
                                            <2e-16 ***
## (Intercept)
## treat
                 2.066
                            2.201
                                   0.939
                                             0.351
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 9.14 on 67 degrees of freedom
## Multiple R-squared: 0.01298,
                                  Adjusted R-squared: -0.001756
```

F-statistic: 0.8808 on 1 and 67 DF, p-value: 0.3514

Models: Controls and Heterogeneous Treatment Effects

The following analyses rely on the treatment group and control group with music. We feel that the control group with music is similar to a placebo because the subjects were subjected to the same conditions as the treatment group, except for the choice of song (the treatment). The control group without music did not have to listen to a song or take a lyrics comprehension quiz. We included this group to help ensure that our control song did not have an effect.

1. Control for gender

```
results$gen[results$Gender == 'Female'] <- 1
results$gen[results$Gender == 'Male'] <- 0
m3 <- lm(EsteemScore ~ treat + treat*gen, data=results[results$TreatControl %in% c('Treatment', 'Control
summary(m3)
##
## lm(formula = EsteemScore ~ treat + treat * gen, data = results[results$TreatControl %in%
       c("Treatment", "Control - Music"), ])
##
##
## Residuals:
                                3Q
##
       Min
                1Q Median
                                       Max
## -13.741
           -7.806 -1.806
                             5.194
                                    38.259
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
               25.7407
                            1.9711 13.059
                                             <2e-16 ***
## (Intercept)
## treat
                -0.3407
                            3.2982
                                    -0.103
                                              0.918
                -2.9343
                            2.6961
                                   -1.088
                                              0.279
## gen
## treat:gen
                 1.8343
                            4.4167
                                     0.415
                                              0.679
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 10.24 on 89 degrees of freedom
```

```
## Multiple R-squared: 0.01503, Adjusted R-squared: -0.01817
## F-statistic: 0.4527 on 3 and 89 DF, p-value: 0.716
```

2. Control for people who really like a song

```
m4 <- lm(EsteemScore ~ treat + factor(LikeSong), data=results[results$TreatControl %in% c('Treatment','
summary(m4)
##
## lm(formula = EsteemScore ~ treat + factor(LikeSong), data = results[results$TreatControl %in%
       c("Treatment", "Control - Music"), ])
##
## Residuals:
      Min
                1Q Median
                               3Q
                                      Max
## -15.483 -6.928 -1.679
                            5.033 39.321
## Coefficients:
##
                                            Estimate Std. Error t value
                                            27.1951
## (Intercept)
                                                        3.8787
                                                                 7.011
                                             0.2878
                                                        2.2718
                                                                0.127
## factor(LikeSong)Dislike somewhat
                                            -7.2226
                                                        4.4773 -1.613
## factor(LikeSong)Like a great deal
                                            -2.2671
                                                        4.7370 -0.479
                                                        3.9861 -0.631
## factor(LikeSong)Like somewhat
                                            -2.5157
## factor(LikeSong)Neither like nor dislike -1.6768
                                                        4.4046 -0.381
                                           Pr(>|t|)
## (Intercept)
                                            4.81e-10 ***
                                              0.899
## treat
## factor(LikeSong)Dislike somewhat
                                              0.110
## factor(LikeSong)Like a great deal
                                              0.633
## factor(LikeSong)Like somewhat
                                              0.530
## factor(LikeSong)Neither like nor dislike
                                              0.704
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.21 on 87 degrees of freedom
## Multiple R-squared: 0.04334, Adjusted R-squared: -0.01164
## F-statistic: 0.7883 on 5 and 87 DF, p-value: 0.5609
```

3. Control for different age groups

```
m5 <- lm(EsteemScore ~ treat + factor(Age), data=results[results$TreatControl %in% c('Treatment','Contr
summary(m5)

##
## Call:
## lm(formula = EsteemScore ~ treat + factor(Age), data = results[results$TreatControl %in%
## c("Treatment", "Control - Music"), ])
##
## Residuals:
```

```
1Q Median
                              3Q
## -13.334 -7.002 -2.082
                           4.913 37.666
## Coefficients:
                     Estimate Std. Error t value Pr(>|t|)
                                 3.0214
                                          8.759 1.4e-13 ***
## (Intercept)
                      26.4641
                                          0.448
## treat
                       0.9953
                                 2.2205
                                                 0.6551
## factor(Age)25 - 34 -1.3772
                                 3.1541 -0.437
                                                  0.6635
## factor(Age)35 - 44 -0.1304
                                 4.1306 -0.032
                                                  0.9749
## factor(Age)45 - 54 -7.4624
                                 4.1169 -1.813
                                                  0.0733
## factor(Age)55 - 64 -7.8617
                                 4.2090 -1.868
                                                  0.0652 .
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10 on 87 degrees of freedom
## Multiple R-squared: 0.08127, Adjusted R-squared: 0.02847
## F-statistic: 1.539 on 5 and 87 DF, p-value: 0.186
```

4. Control for gender and age groups

```
m6 <- lm(EsteemScore ~ treat + treat*gen + factor(Age), data=results[results$TreatControl %in% c('Treat
summary(m6)
##
## Call:
## lm(formula = EsteemScore ~ treat + treat * gen + factor(Age),
      data = results[results$TreatControl %in% c("Treatment", "Control - Music"),
##
          ])
##
## Residuals:
      Min
               1Q Median
                               30
                                      Max
## -13.400 -6.805 -1.664
                            5.195 36.854
## Coefficients:
                     Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                     27.06951 3.45088
                                          7.844 1.16e-11 ***
## treat
                     -0.19180
                                 3.28849 -0.058
                                                   0.9536
## gen
                     -1.42659
                                 2.75391
                                          -0.518
                                                   0.6058
## factor(Age)25 - 34 -1.26413
                                 3.32736 -0.380
                                                   0.7050
## factor(Age)35 - 44 0.07643
                                 4.24927
                                          0.018
                                                   0.9857
## factor(Age)45 - 54 -7.07248
                                         -1.679
                                 4.21269
                                                   0.0969
## factor(Age)55 - 64 -7.69620
                                 4.27691
                                         -1.799
                                                   0.0755
## treat:gen
                      2.21304
                                 4.48628
                                          0.493
                                                   0.6231
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.1 on 85 degrees of freedom
## Multiple R-squared: 0.08482,
                                 Adjusted R-squared:
## F-statistic: 1.125 on 7 and 85 DF, p-value: 0.3549
```

5. Control for gender and age groups, and if they liked the song

```
m7 <- lm(EsteemScore ~ treat + treat*gen + factor(Age) + factor(LikeSong), data=results[results$TreatConditions]
summary(m7)
##
## Call:
## lm(formula = EsteemScore ~ treat + treat * gen + factor(Age) +
       factor(LikeSong), data = results[results$TreatControl %in%
       c("Treatment", "Control - Music"), ])
##
##
## Residuals:
       Min
                                3Q
                1Q Median
## -13.539 -7.607 -1.582
                             4.970 36.855
## Coefficients:
                                             Estimate Std. Error t value
                                                          5.4469
## (Intercept)
                                              32.6879
                                                                   6.001
## treat
                                              -0.9425
                                                          3.3371 -0.282
                                              -1.7035
                                                          2.7679 -0.615
## gen
## factor(Age)25 - 34
                                              -1.5776
                                                          3.4068 -0.463
## factor(Age)35 - 44
                                              -0.4046
                                                          4.3413 -0.093
## factor(Age)45 - 54
                                              -7.2902
                                                          4.2732 -1.706
## factor(Age)55 - 64
                                              -8.8770
                                                          4.4786 - 1.982
## factor(LikeSong)Dislike somewhat
                                              -8.8734
                                                          4.5432 -1.953
## factor(LikeSong)Like a great deal
                                                          5.0182 -0.956
                                              -4.7958
## factor(LikeSong)Like somewhat
                                              -5.1379
                                                          4.1708 -1.232
## factor(LikeSong)Neither like nor dislike -3.4628
                                                          4.5926 - 0.754
                                                          4.4944 0.639
## treat:gen
                                               2.8709
                                             Pr(>|t|)
## (Intercept)
                                             5.26e-08 ***
## treat
                                               0.7783
                                               0.5400
## gen
## factor(Age)25 - 34
                                               0.6446
## factor(Age)35 - 44
                                               0.9260
## factor(Age)45 - 54
                                               0.0918
## factor(Age)55 - 64
                                               0.0509
## factor(LikeSong)Dislike somewhat
                                               0.0543
## factor(LikeSong)Like a great deal
                                               0.3421
## factor(LikeSong)Like somewhat
                                               0.2216
## factor(LikeSong)Neither like nor dislike
                                               0.4530
## treat:gen
                                               0.5248
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 10.06 on 81 degrees of freedom
## Multiple R-squared: 0.1346, Adjusted R-squared: 0.01708
## F-statistic: 1.145 on 11 and 81 DF, p-value: 0.3383
Results table. Removed model 2 because it relies on the control group with no music. Saves to html document
in local directory
stargazer(m1, m3, m4, m5, m6, m7, title="Results: Treatment vs. Control (with Music)", no.space=TRUE, or
```

[%] Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu

Table 1: Results: Treatment vs. Control (with Music)

	Dependent variable:			
	EsteemScore			emScore
	(1)	(2)	(3)	(4)
treat	0.599 (2.184)	-0.341 (3.298)	0.288 (2.272)	0.995 (2.221)
gen		-2.934 (2.696)		
treat:gen		$ \begin{array}{c} 1.834 \\ (4.417) \end{array} $		
$factor(LikeSong) Dislike \ somewhat$			-7.223 (4.477)	
factor(LikeSong)Like a great deal			-2.267 (4.737)	
${\it factor}({\it LikeSong}){\it Like somewhat}$			-2.516 (3.986)	
${\it factor}({\it LikeSong}) {\it Neither like nor dislike}$			-1.677 (4.405)	
factor(Age)25 - 34			,	-1.377 (3.154)
factor(Age)35 - 44				-0.130 (4.131)
factor(Age)45 - 54				-7.462^* (4.117)
factor(Age)55 - 64				-7.862^* (4.209)
Constant	24.172*** (1.340)	25.741*** (1.971)	27.195*** (3.879)	26.464*** (3.021)
Observations	93	93	93	93
R^2	0.001	0.015	0.043	0.081
Adjusted R^2	-0.010	-0.018	-0.012	0.028
Residual Std. Error	10.202 (df = 91)	10.242 (df = 89)	10.209 (df = 87)	10.005 (df = 8)
F Statistic	0.075 (df = 1; 91)	0.453 (df = 3; 89)	0.788 (df = 5; 87)	1.539 (df = 5; 8)

Note:

Analysis of Results

We never found our treatment effect to be statistically significant. However, we did see that subjects in the treatment group had lower self esteem than the subjects in the control group. We also saw that our treatment was associated with lower self esteem in females compared to males. We hypothesized both of these outcomes. We also noticed that older subjects appeared to have higher self esteem compared to younger subjects. Even though the results were not significant, our study could be a worth continuing because we saw effects in the same direction that we hypothesized. Maybe with more data, or an altered experiment, we would see significant effects.