

Mental Health

Capstone Project

Cohort B: Alvaro Chinchayan, Leighton Li, Andrey Lifar, Yoki Liu, Yue Ping, Sherry Zuo

2/27/2020

Our main goal is to answer questions for:

What's the overview of people's mental health problem?

Can you predict whether a patient should be treated of his/her mental illness or not according to the value obtained based on our data?

Is there a correlation between mental health and whether job lets them take them break/ allow them to work from home/remote worker?

What can we get for the tweets data?

Our first part will focus on the OSMI Mental Health in Tech Surveys data

We merged 2016-2019 data into a new dataset by python, more code could see in the Mental_Health.ipynb file. We will use the merged dataset "mental_health" to do an overview of the mental illness

We will do supervised machine learning focus on the year 2014 data

Data Loading

```
#import data
data<-read_csv("~/Desktop/mental_health.csv")

## Warning: Missing column names filled in: 'X1' [1]

## Parsed with column specification:
## cols(
##   .default = col_character(),
##   X1 = col_double(),
##   self_empl_flag = col_double(),
##   tech_comp_flag = col_double(),
##   tech_role_flag = col_double(),
##   prev_employers_flag = col_double(),
##   age = col_double(),
##   sex = col_double()
## )

## See spec(...) for full column specifications.

## Warning: 608 parsing failures.
##   row      col expected actual      file
## 2607 tech_comp_flag a double   True '~/Desktop/mental_health.csv'
## 2607 tech_role_flag a double   True '~/Desktop/mental_health.csv'
## 2608 tech_comp_flag a double   True '~/Desktop/mental_health.csv'
## 2608 tech_role_flag a double   True '~/Desktop/mental_health.csv'
## 2609 tech_comp_flag a double   True '~/Desktop/mental_health.csv'
## ....
## See problems(...) for more details.
```

```
data2014<-read_csv("~/Desktop/2014.csv")
```

```
## Parsed with column specification:
## cols(
##   .default = col_character(),
##   Age = col_double()
## )
## See spec(...) for full column specifications.
```

Data Cleaning

```
#remove first column since it's just the numbers of row
data<-data[,2:29]
```

```
skim(data)
```

```
## Skim summary statistics
##   n obs: 2958
##   n variables: 28
##
## -- Variable type:character -----
##           variable missing complete    n min  max empty
##           comp_no_empl    504    2454 2958    3    8     0
##           country_live     2    2956 2958    2   22     0
##           country_work     2    2956 2958    2   22     0
##           future_ph_specification 0    2958 2958    2    5     0
##           live_us_teritory 1106    1852 2958    4   20     0
##           mh_anonymity_flag 504    2454 2958    2   12     0
##           mh_bad_response_workplace 91    2867 2958    2   30     0
##           mh_diagnosed&reveal_clients_flag 2454    504 2958   11   41     0
##           mh_diagnosed&reveal_cowork_flag 2454    504 2958   11   41     0
##           mh_disorder_current    0    2958 2958    2   10     0
##           mh_disorder_past    15    2943 2958    2   10     0
##           mh_employer_discussion 504    2454 2958    2   12     0
##           mh_family_hist    0    2958 2958    2   12     0
##           mh_prod_impact 2454    504 2958    2   20     0
##           mh_prod_impact_perc 2591    367 2958    5    7     0
##           mh_sharing_friends/fam_flag 0    2958 2958    1   53     0
##           prev_mh_anonymity 368    2590 2958    2   12     0
##           prev_mh_benefits 368    2590 2958    8   17     0
##           prev_mh_benefits_awareness 368    2590 2958   18   31     0
##           prev_mh_discussion 368    2590 2958    8   17     0
##           why/why_not    696    2262 2958    1 2475     0
##           work_us_teritory 1086    1872 2958    4   20     0
##   n_unique
##         6
##        73
##        76
##         3
##        48
##         3
##         5
```

```
##      5
##      5
##      5
##      5
##      3
##      3
##      4
##      4
##     17
##      4
##      4
##      6
##      4
##    2215
##      50
##
## -- Variable type:numeric -----
##      variable missing complete      n mean  sd p0 p25 p50 p75 p100
##      age          2      2956 2958 34.61 8.25 18  29  33  39  74
## prev_employers_flag      0      2958 2958  0.88 0.33  0   1   1   1   1
##      self_empl_flag      0      2958 2958  0.17 0.38  0   0   0   0   1
##      sex            24      2934 2958  1.32 0.52  1   1   1   2   3
##      tech_comp_flag    808      2150 2958  0.77 0.42  0   1   1   1   1
##      tech_role_flag   1691      1267 2958  0.94 0.24  0   1   1   1   1
##      hist
##
##
##
##
##
##
```

```
#rename columns
```

```
names(data2014)[5:27]<-c("state","self_employed","family_history","mh_treatment", "interfere","company_
```

```
skim(data2014)
```

```
## Skim summary statistics
```

```
## n obs: 1260
```

```
## n variables: 27
```

```
##
```

```
## -- Variable type:character -----
```

```
##      variable missing complete      n min  max empty
##      anonymity_protected      0      1260 1260   2   10     0
##      awareness_mh_benefits      0      1260 1260   2    8     0
##      comments          1097      163 1260   1 3589     0
##      company_size          0      1260 1260   3   14     0
##      Country              0      1260 1260   5   22     0
##      family_history          0      1260 1260   2    3     0
##      Gender                0      1260 1260   1   46     0
##      interfere            264      996 1260   5    9     0
##      interview_mh_bringup      0      1260 1260   2    5     0
##      interview_ph_bringup      0      1260 1260   2    5     0
```

```

##          medical_leave_easy      0      1260 1260      9      18      0
##          mh_benefits             0      1260 1260      2      10      0
##          mh_discuss              0      1260 1260      2      10      0
##          mh_disscuss_coworker     0      1260 1260      2      12      0
##          mh_disscuss_supervisor   0      1260 1260      2      12      0
##          mh_negative_consequence_flag 0      1260 1260      2      5      0
##          mh_resources             0      1260 1260      2      10      0
##          mh_serious_ph            0      1260 1260      2      10      0
##          mh_treatment            0      1260 1260      2      3      0
##          ph_negative_consequence_flag 0      1260 1260      2      5      0
##          remote                  0      1260 1260      2      3      0
##          self_employed            18      1242 1260      2      3      0
##          state                   516      744 1260      2      2      0
##          tech_company            0      1260 1260      2      3      0
##          Timestamp               0      1260 1260     16     19      0
##          witness_mh_nc           0      1260 1260      2      3      0
##          n_unique
##          3
##          3
##          159
##          6
##          48
##          2
##          47
##          4
##          3
##          3
##          5
##          3
##          3
##          3
##          3
##          3
##          3
##          3
##          3
##          3
##          2
##          3
##          2
##          2
##          45
##          2
##          1249
##          2
##
## -- Variable type:numeric -----
## variable missing complete      n      mean      sd      p0 p25 p50 p75 p100
##      Age      0      1260 1260 7.9e+07 2.8e+09 -1726  27  31  36 1e+11
##      hist
##

```

```

#make a copy of our data
maindata<-data2014
#drop variables "Timestamp", "Country", "comments" just to make our lives easier.
maindata<-subset(maindata, select = -c(1,4,27))

```

```
names(maindata)[1:2]<-c("age","gender")
```

```
data.table(maindata)
```

```
##      age gender state self_employed family_history mh_treatment interfere
##    1:  37 Female   IL          <NA>          No          Yes      Often
##    2:  44      M   IN          <NA>          No          No      Rarely
##    3:  32  Male <NA>          <NA>          No          No      Rarely
##    4:  31  Male <NA>          <NA>         Yes          Yes      Often
##    5:  31  Male  TX          <NA>          No          No      Never
## ---
## 1256:  32  Male   IL          No          Yes          Yes      Often
## 1257:  34  male   CA          No          Yes          Yes  Sometimes
## 1258:  46    f    NC          No          No          No      <NA>
## 1259:  25  Male   IL          No          Yes          Yes  Sometimes
## 1260:  41  Male <NA>          No          No          No  Sometimes
##      company_size remote tech_company mh_benefits awareness_mh_benefits
##    1:          6-25      No          Yes          Yes          Not sure
##    2: More than 1000      No          No  Don't know          No
##    3:          6-25      No          Yes          No          No
##    4:          26-100      No          Yes          No          Yes
##    5:          100-500  Yes          Yes          Yes          No
## ---
## 1256:          26-100  Yes          Yes          Yes          Yes
## 1257: More than 1000      No          Yes          Yes          Yes
## 1258:          100-500  Yes          Yes          No          Yes
## 1259:          26-100      No          No          Yes          Yes
## 1260:          500-1000  No          No          No          No
##      mh_discuss mh_resources anonymity_protected medical_leave_easy
##    1:          No          Yes          Yes          Somewhat easy
##    2: Don't know  Don't know          Don't know          Don't know
##    3:          No          No          Don't know  Somewhat difficult
##    4:          No          No          No          Somewhat difficult
##    5: Don't know  Don't know          Don't know          Don't know
## ---
## 1256:          No          No          Yes  Somewhat difficult
## 1257:          No          No          Don't know  Somewhat difficult
## 1258:          No          No          Don't know          Don't know
## 1259:          No          No          Yes          Don't know
## 1260:          No          No          Don't know          Don't know
##      mh_negative_consequence_flag ph_negative_consequence_flag
##    1:          No          No
##    2:          Maybe          No
##    3:          No          No
##    4:          Yes          Yes
##    5:          No          No
## ---
## 1256:          No          No
## 1257:          Yes          Yes
## 1258:          Yes          No
## 1259:          Maybe          No
## 1260:          Yes          No
##      mh_disscuss_coworker mh_disscuss_supervisor interview_mh_bringup
```

```

##      1:      Some of them      Yes      No
##      2:      No      No      No
##      3:      Yes      Yes      Yes
##      4:      Some of them      No      Maybe
##      5:      Some of them      Yes      Yes
##      ---
## 1256:      Some of them      Yes      No
## 1257:      No      No      No
## 1258:      No      No      No
## 1259:      Some of them      No      No
## 1260:      Some of them      No      No
##      interview_ph_bringup mh_serious_ph witness_mh_nc
##      1:      Maybe      Yes      No
##      2:      No      Don't know      No
##      3:      Yes      No      No
##      4:      Maybe      No      Yes
##      5:      Yes      Don't know      No
##      ---
## 1256:      No      Yes      No
## 1257:      No      No      No
## 1258:      No      No      No
## 1259:      No      Don't know      No
## 1260:      Maybe      No      Yes

```

```
skim(maindata)
```

```

## Skim summary statistics
## n obs: 1260
## n variables: 24
##
## -- Variable type:character -----
##      variable missing complete      n min max empty n_unique
##      anonymity_protected      0      1260 1260      2 10      0      3
##      awareness_mh_benefits      0      1260 1260      2  8      0      3
##      company_size      0      1260 1260      3 14      0      6
##      family_history      0      1260 1260      2  3      0      2
##      gender      0      1260 1260      1 46      0     47
##      interfere      264      996 1260      5  9      0      4
##      interview_mh_bringup      0      1260 1260      2  5      0      3
##      interview_ph_bringup      0      1260 1260      2  5      0      3
##      medical_leave_easy      0      1260 1260      9 18      0      5
##      mh_benefits      0      1260 1260      2 10      0      3
##      mh_discuss      0      1260 1260      2 10      0      3
##      mh_disscuss_coworker      0      1260 1260      2 12      0      3
##      mh_disscuss_supervisor      0      1260 1260      2 12      0      3
##      mh_negative_consequence_flag      0      1260 1260      2  5      0      3
##      mh_resources      0      1260 1260      2 10      0      3
##      mh_serious_ph      0      1260 1260      2 10      0      3
##      mh_treatment      0      1260 1260      2  3      0      2
##      ph_negative_consequence_flag      0      1260 1260      2  5      0      3
##      remote      0      1260 1260      2  3      0      2
##      self_employed      18     1242 1260      2  3      0      2
##      state      516      744 1260      2  2      0     45
##      tech_company      0      1260 1260      2  3      0      2

```

```
##          witness_mh_nc      0      1260 1260      2      3      0      2
##
## -- Variable type:numeric -----
##  variable missing complete      n      mean      sd      p0 p25 p50 p75 p100
##    age          0      1260 1260 7.9e+07 2.8e+09 -1726  27  31  36 1e+11
##    hist
##
```

```
#make word into lowercases in column gender
maindata$gender<-str_to_lower(maindata$gender)
#build gender group
male_str = c("male", "m", "male-ish", "maile", "mal", "male (cis)", "make", "male ", "man", "msle", "mai.
trans_str = c("trans-female", "something kinda male?", "queer/she/they", "non-binary", "nah", "all", "en
female_str = c("cis female", "f", "female", "woman", "femake", "female ", "cis-female/femme", "female (
#replace details
maindata$gender <- ifelse(maindata$gender %in% male_str, "M", ifelse(maindata$gender %in% female_str, "F"
```

```
#we want to focus on the US
maindata<-maindata[!is.na(maindata$state),]
```

```
#remove other NAs
maindata<-na.omit(maindata)
```

```
skim(maindata)
```

```
## Skim summary statistics
##  n obs: 589
##  n variables: 24
##
## -- Variable type:character -----
##      variable missing complete      n min max empty n_unique
##      anonymity_protected      0      589 589      2  10      0      3
##      awareness_mh_benefits      0      589 589      2   8      0      3
##      company_size      0      589 589      3  14      0      6
##      family_history      0      589 589      2   3      0      2
##      gender      0      589 589      1   1      0      3
##      interfere      0      589 589      5   9      0      4
##      interview_mh_bringup      0      589 589      2   5      0      3
##      interview_ph_bringup      0      589 589      2   5      0      3
##      medical_leave_easy      0      589 589      9  18      0      5
##      mh_benefits      0      589 589      2  10      0      3
##      mh_discuss      0      589 589      2  10      0      3
##      mh_disscuss_coworker      0      589 589      2  12      0      3
##      mh_disscuss_supervisor      0      589 589      2  12      0      3
##      mh_negative_consequence_flag      0      589 589      2   5      0      3
##      mh_resources      0      589 589      2  10      0      3
##      mh_serious_ph      0      589 589      2  10      0      3
##      mh_treatment      0      589 589      2   3      0      2
##      ph_negative_consequence_flag      0      589 589      2   5      0      3
##      remote      0      589 589      2   3      0      2
##      self_employed      0      589 589      2   3      0      2
##      state      0      589 589      2   2      0     43
##      tech_company      0      589 589      2   3      0      2
```

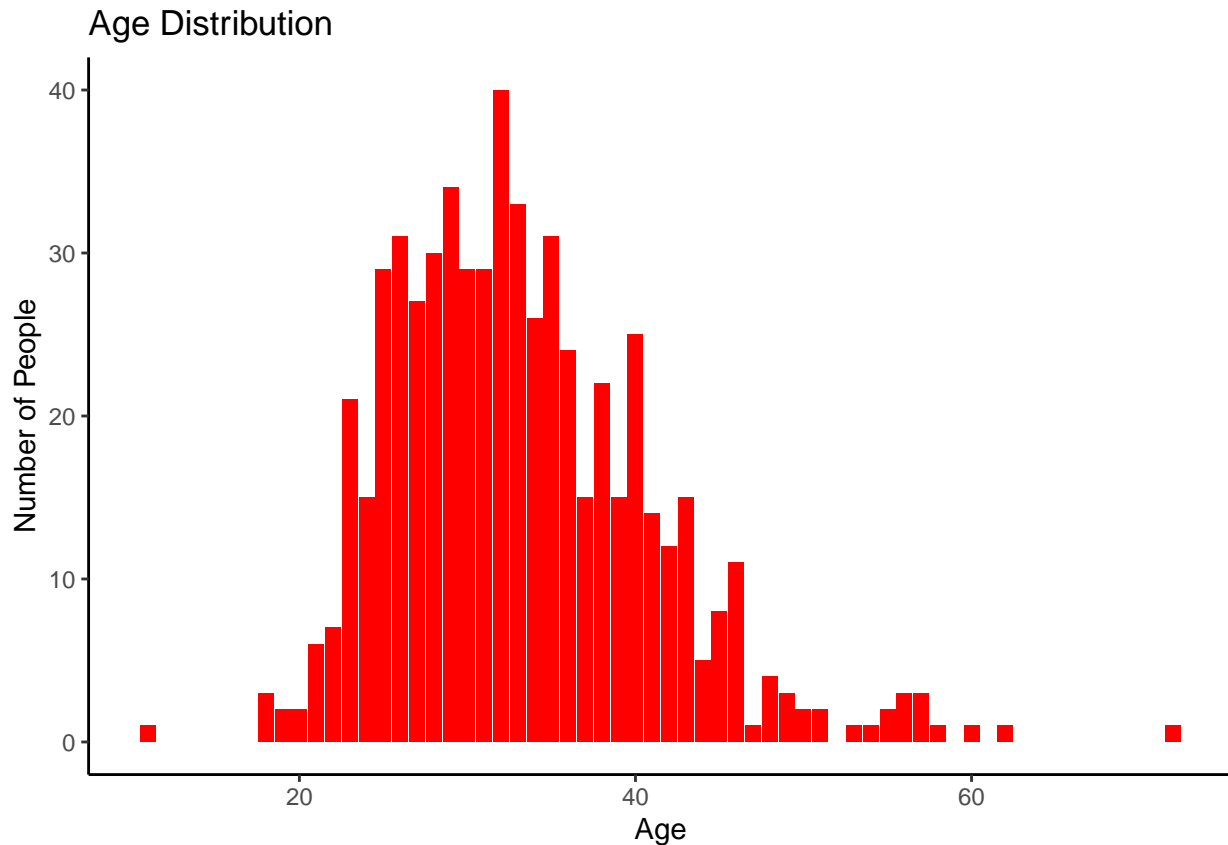
```
##          witness_mh_nc      0      589 589   2   3      0      2
##
## -- Variable type:numeric -----
##  variable missing complete   n  mean    sd p0 p25 p50 p75 p100    hist
##    age      0      589 589 33.67 14.41 11  28  32  38  329
```

```
#there is one person list 329, so delete this row
maindata<-maindata[maindata$age!=329,]
```

```
names(maindata)
```

```
## [1] "age"          "gender"
## [3] "state"        "self_employed"
## [5] "family_history" "mh_treatment"
## [7] "interfere"    "company_size"
## [9] "remote"       "tech_company"
## [11] "mh_benefits"  "awareness_mh_benefits"
## [13] "mh_discuss"   "mh_resources"
## [15] "anonymity_protected" "medical_leave_easy"
## [17] "mh_negative_consequence_flag" "ph_negative_consequence_flag"
## [19] "mh_disscuss_coworker" "mh_disscuss_supervisor"
## [21] "interview_mh_bringup" "interview_ph_bringup"
## [23] "mh_serious_ph" "witness_mh_nc"
```

```
maindata%>%
  ggplot(aes(x=age))+
  geom_bar(fill="red")+
  labs(title="Age Distribution", x="Age", y="Number of People")+
  theme(panel.background = element_rect(fill="transparent"),
        axis.line = element_line(colour = "black"))
```

```
# maindata%>%
#   group_by(age)%>%
#   tally() %>%
#   ggplot(aes(x=age,y = n))+
#   geom_bar(stat = 'identity', fill="red")+
#   labs(title="Age Distribution", x="Age", y="Number of People")+
#   theme(panel.background = element_rect(fill="transparent"),
#         axis.line = element_line(colour = "black")) +
#   geom_text(aes(label = n))
```

```
a=table(maindata$gender)
a
```

```
##
##      F      M      T
## 147  433      8
```

```
str(a)
```

```
##  'table' int [1:3(1d)] 147 433 8
##  - attr(*, "dimnames")=List of 1
##    ..$ : chr [1:3] "F" "M" "T"
```

```
gender_count<-as.vector(a)
gender_percentage<-c("Female","Male","Transgender")
gender_count
```

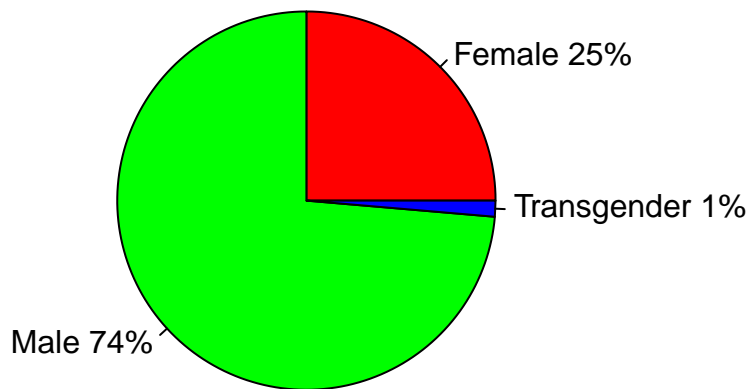
```
## [1] 147 433 8
```

```
gender_percentage
```

```
## [1] "Female"      "Male"        "Transgender"
```

```
pct1 <- round(gender_count/sum(gender_count)*100)
gender_percentage <- paste(gender_percentage, pct1) # add percents to labels
gender_percentage <- paste(gender_percentage,"%",sep="") # ad % to labels
pie(gender_count,labels = gender_percentage, col=rainbow(length(gender_percentage)),
    main="Pie Chart of Gender")
```

Pie Chart of Gender



```
#state could make a map, still considering
```

```
b=table(maindata$self_employed)
b
```

```
##
## No Yes
## 540 48
```

```
str(b)
```

```
## 'table' int [1:2(1d)] 540 48
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:2] "No" "Yes"
```

```
self_employed_count<-as.vector(b)
self_employed_percentage<-names(b)
self_employed_count
```

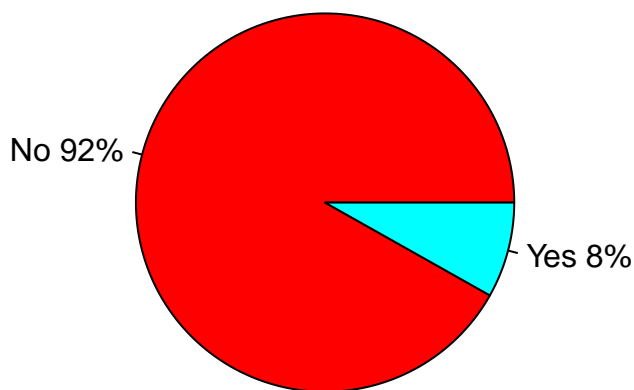
```
## [1] 540 48
```

```
self_employed_percentage
```

```
## [1] "No" "Yes"
```

```
pct2 <- round(self_employed_count/sum(self_employed_count)*100)
self_employed_percentage <- paste(self_employed_percentage, pct2) # add percents to labels
self_employed_percentage <- paste(self_employed_percentage,"%",sep="") # ad % to labels
pie(self_employed_count,labels = self_employed_percentage, col=rainbow(length(self_employed_percentage))
    main="Pie Chart of Self_Employed")
```

Pie Chart of Self_Employed



```
c=table(maindata$family_history)
c
```

```
##
## No Yes
## 294 294
```

```
str(c)
```

```
## 'table' int [1:2(1d)] 294 294
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:2] "No" "Yes"
```

```
family_history_count<-as.vector(c)
family_history_percentage<-names(c)
family_history_count
```

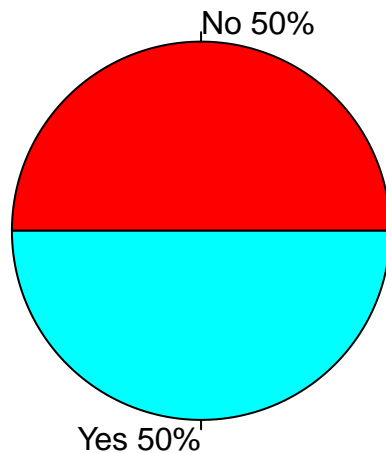
```
## [1] 294 294
```

```
family_history_percentage
```

```
## [1] "No" "Yes"
```

```
pct3 <- round(family_history_count/sum(family_history_count)*100)
family_history_percentage <- paste(family_history_percentage, pct3) # add percents to labels
family_history_percentage <- paste(family_history_percentage,"%",sep="") # ad % to labels
pie(family_history_count,labels = family_history_percentage, col=rainbow(length(family_history_percenta
  main="Pie Chart of Family History of Mental Health")
```

Pie Chart of Family History of Mental Health



```
#Our outcome variable
d=table(maindata$mh_treatment)
d
```

```
##
## No Yes
## 192 396
```

```
str(d)
```

```
## 'table' int [1:2(1d)] 192 396
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:2] "No" "Yes"
```

```
mh_treatment_count<-as.vector(d)
mh_treatment_percentage<-names(d)
mh_treatment_count
```

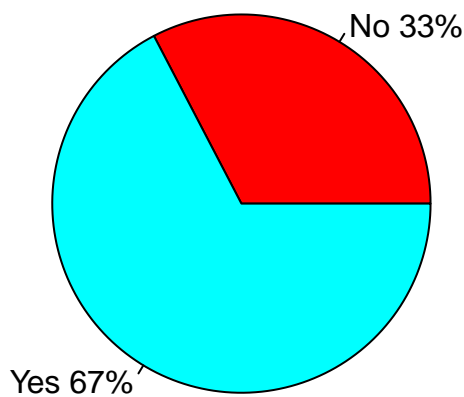
```
## [1] 192 396
```

```
mh_treatment_percentage
```

```
## [1] "No" "Yes"
```

```
pct4 <- round(mh_treatment_count/sum(mh_treatment_count)*100)
mh_treatment_percentage <- paste(mh_treatment_percentage, pct4) # add percents to labels
mh_treatment_percentage <- paste(mh_treatment_percentage, "%", sep="") # ad % to labels
pie(mh_treatment_count, labels = mh_treatment_percentage, col=rainbow(length(mh_treatment_percentage)),
    main="Pie Chart of Whether seeking Mental Health Treatment")
```

Pie Chart of Whether seeking Mental Health Treatment



```
e=table(maindata$interfere)
e
```

```
##
##      Never      Often      Rarely Sometimes
##       121       78       107       282
```

```
str(e)
```

```
## 'table' int [1:4(1d)] 121 78 107 282
## - attr(*, "dimnames")=List of 1
##   ..$ : chr [1:4] "Never" "Often" "Rarely" "Sometimes"
```

```
interfere_count<-as.vector(e)
interfere_percentage<-names(e)
interfere_count
```

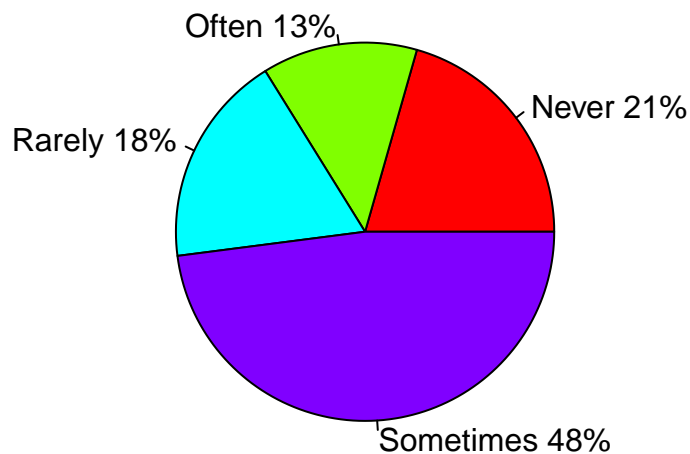
```
## [1] 121 78 107 282
```

```
interfere_percentage
```

```
## [1] "Never" "Often" "Rarely" "Sometimes"
```

```
pct5 <- round(interfere_count/sum(interfere_count)*100)
interfere_percentage <- paste(interfere_percentage, pct5) # add percents to labels
interfere_percentage <- paste(interfere_percentage, "%", sep="") # ad % to labels
pie(interfere_count, labels = interfere_percentage, col=rainbow(length(interfere_percentage)),
    main="Pie Chart of Interfere")
```

Pie Chart of Interfere



```
f=table(maindata$company_size)
f
```

```
##
##      1-5      100-500      26-100      500-1000      6-25
##      67       90       136       30       100
## More than 1000
##      165
```

```
str(f)
```

```
## 'table' int [1:6(1d)] 67 90 136 30 100 165
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:6] "1-5" "100-500" "26-100" "500-1000" ...
```

```
company_size_count<-as.vector(f)
company_size_percentage<-names(f)
company_size_count
```

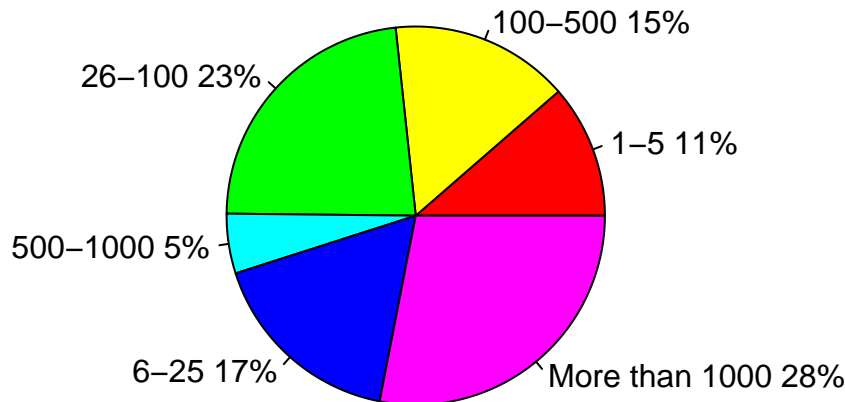
```
## [1] 67 90 136 30 100 165
```

```
company_size_percentage
```

```
## [1] "1-5"      "100-500"  "26-100"   "500-1000"
## [5] "6-25"     "More than 1000"
```

```
pct6 <- round(company_size_count/sum(company_size_count)*100)
company_size_percentage <- paste(company_size_percentage, pct6) # add percents to labels
company_size_percentage <- paste(company_size_percentage, "%", sep="") # ad % to labels
pie(company_size_count, labels = company_size_percentage, col=rainbow(length(company_size_percentage)),
    main="Pie Chart of Company Size")
```

Pie Chart of Company Size



```
g=table(maindata$remote)
g
```

```
##
## No Yes
## 403 185
```

```
str(g)
```

```
## 'table' int [1:2(1d)] 403 185
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:2] "No" "Yes"
```

```
remote_count<-as.vector(g)
remote_percentage<-names(g)
remote_count
```

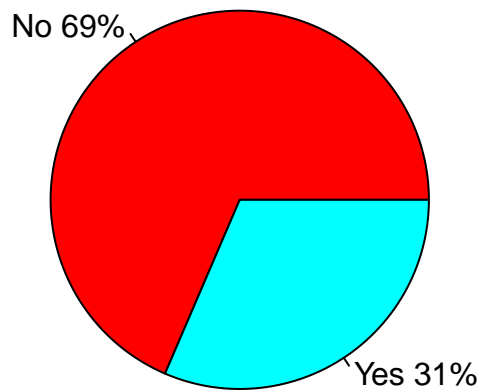
```
## [1] 403 185
```

```
remote_percentage
```

```
## [1] "No" "Yes"
```

```
pct7 <- round(remote_count/sum(remote_count)*100)
remote_percentage <- paste(remote_percentage, pct7) # add percents to labels
remote_percentage <- paste(remote_percentage, "%", sep="") # ad % to labels
pie(remote_count, labels = remote_percentage, col=rainbow(length(remote_percentage)),
    main="Pie Chart of Remote")
```

Pie Chart of Remote



```
h=table(maindata$tech_company)
h
```

```
##
##  No Yes
## 105 483
```

```
str(h)
```

```
##  'table' int [1:2(1d)] 105 483
## - attr(*, "dimnames")=List of 1
##  ..$ : chr [1:2] "No" "Yes"
```

```
tech_company_count<-as.vector(h)
tech_company_percentage<-names(h)
tech_company_count
```

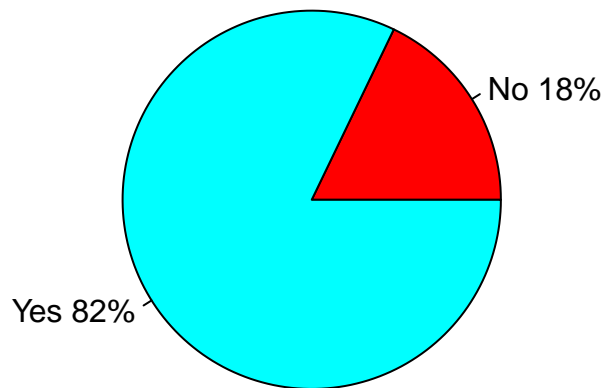
```
## [1] 105 483
```

```
tech_company_percentage
```

```
## [1] "No"  "Yes"
```

```
pct8 <- round(tech_company_count/sum(tech_company_count)*100)
tech_company_percentage <- paste(tech_company_percentage, pct8) # add percents to labels
tech_company_percentage <- paste(tech_company_percentage,"%",sep="") # ad % to labels
pie(tech_company_count,labels = tech_company_percentage, col=rainbow(length(tech_company_percentage)),
    main="Pie Chart of Tech Company")
```


Pie Chart of Tech Company



```
i=table(maindata$mh_benefits)
i
```

```
##
## Don't know      No      Yes
##      163      97     328
```

```
str(i)
```

```
## 'table' int [1:3(1d)] 163 97 328
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Don't know" "No" "Yes"
```

```
mh_benefits_count<-as.vector(i)
mh_benefits_percentage<-names(i)
mh_benefits_count
```

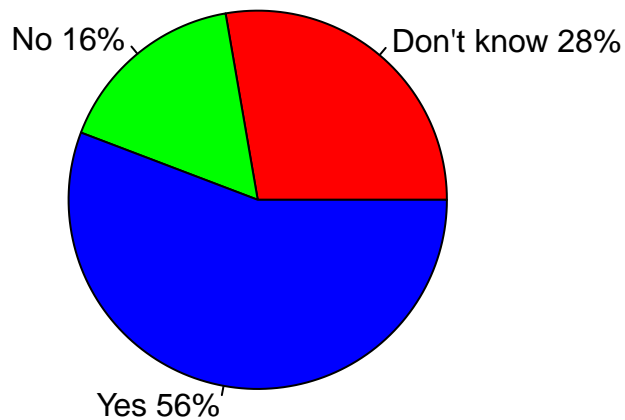
```
## [1] 163 97 328
```

```
mh_benefits_percentage
```

```
## [1] "Don't know" "No" "Yes"
```

```
pct9 <- round(mh_benefits_count/sum(mh_benefits_count)*100)
mh_benefits_percentage <- paste(mh_benefits_percentage, pct9) # add percents to labels
mh_benefits_percentage <- paste(mh_benefits_percentage,"%",sep="") # ad % to labels
pie(mh_benefits_count,labels = mh_benefits_percentage, col=rainbow(length(mh_benefits_percentage)),
    main="Pie Chart of Mental Health Benefits")
```

Pie Chart of Mental Health Benefits



```
j=table(maindata$awareness_mh_benefits)
j
```

```
##
##      No Not sure      Yes
##      173      141      274
```

```
str(j)
```

```
## 'table' int [1:3(1d)] 173 141 274
## - attr(*, "dimnames")=List of 1
##   ..$ : chr [1:3] "No" "Not sure" "Yes"
```

```
awareness_mh_benefits_count<-as.vector(j)
awareness_mh_benefits_percentage<-names(j)
awareness_mh_benefits_count
```

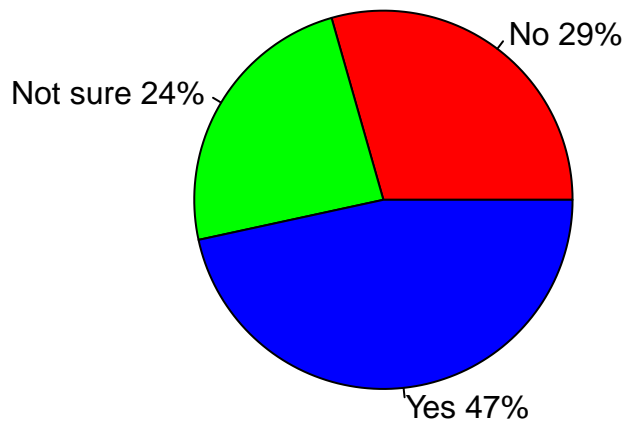
```
## [1] 173 141 274
```

```
awareness_mh_benefits_percentage
```

```
## [1] "No"      "Not sure" "Yes"
```

```
pct10 <- round(awareness_mh_benefits_count/sum(awareness_mh_benefits_count)*100)
awareness_mh_benefits_percentage <- paste(awareness_mh_benefits_percentage, pct10) # add percents to labels
awareness_mh_benefits_percentage <- paste(awareness_mh_benefits_percentage,"%",sep="") # add % to labels
pie(awareness_mh_benefits_count,labels = awareness_mh_benefits_percentage, col=rainbow(length(awareness_mh_benefits_count)),
    main="Pie Chart of Awareness of Mental Health Benefits")
```

Pie Chart of Awareness of Mental Health Benefits



```
k=table(maindata$mh_discuss)
k
```

```
##
## Don't know      No      Yes
##           91    358    139
```

```
str(k)
```

```
## 'table' int [1:3(1d)] 91 358 139
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Don't know" "No" "Yes"
```

```
mh_discuss_count<-as.vector(k)
mh_discuss_percentage<-names(k)
mh_discuss_count
```

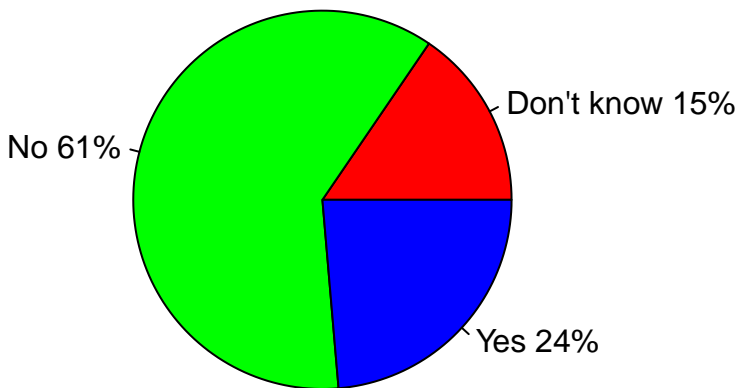
```
## [1] 91 358 139
```

```
mh_discuss_percentage
```

```
## [1] "Don't know" "No" "Yes"
```

```
pct11 <- round(mh_discuss_count/sum(mh_discuss_count)*100)
mh_discuss_percentage <- paste(mh_discuss_percentage, pct11) # add percents to labels
mh_discuss_percentage <- paste(mh_discuss_percentage,"%",sep="") # ad % to labels
pie(mh_discuss_count,labels = mh_discuss_percentage, col=rainbow(length(mh_discuss_percentage)),
    main="Pie Chart of Mental Health Discussion")
```

Pie Chart of Mental Health Discussion



```
l=table(maindata$mh_resources)
l
```

```
##
## Don't know      No      Yes
##      194      236      158
```

```
str(l)
```

```
## 'table' int [1:3(1d)] 194 236 158
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Don't know" "No" "Yes"
```

```
mh_resources_count<-as.vector(l)
mh_resources_percentage<-names(l)
mh_resources_count
```

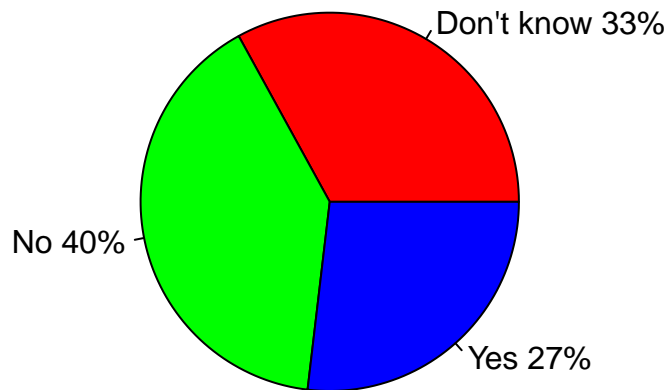
```
## [1] 194 236 158
```

```
mh_resources_percentage
```

```
## [1] "Don't know" "No"      "Yes"
```

```
pct12 <- round(mh_resources_count/sum(mh_resources_count)*100)
mh_resources_percentage <- paste(mh_resources_percentage, pct12) # add percents to labels
mh_resources_percentage <- paste(mh_resources_percentage,"%",sep="") # ad % to labels
pie(mh_resources_count,labels = mh_resources_percentage, col=rainbow(length(mh_resources_percentage)),
    main="Pie Chart of Mental Health Resources")
```

Pie Chart of Mental Health Resources



```
m=table(maindata$anonymity_protected)
m
```

```
##
## Don't know      No      Yes
##      379      15      194
```

```
str(m)
```

```
## 'table' int [1:3(1d)] 379 15 194
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Don't know" "No" "Yes"
```

```
anonymity_protected_count<-as.vector(m)
anonymity_protected_percentage<-names(m)
anonymity_protected_count
```

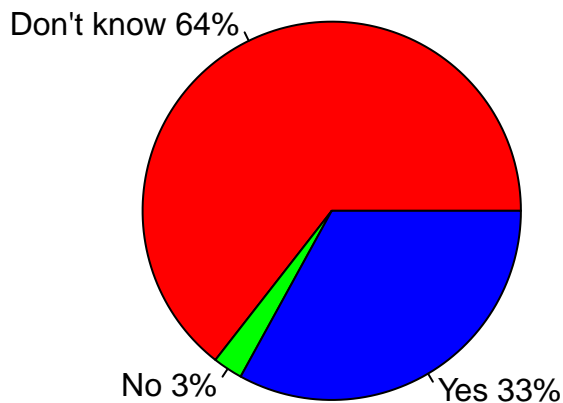
```
## [1] 379 15 194
```

```
anonymity_protected_percentage
```

```
## [1] "Don't know" "No" "Yes"
```

```
pct13 <- round(anonymity_protected_count/sum(anonymity_protected_count)*100)
anonymity_protected_percentage <- paste(anonymity_protected_percentage, pct13) # add percents to labels
anonymity_protected_percentage <- paste(anonymity_protected_percentage,"%",sep="") # ad % to labels
pie(anonymity_protected_count,labels = anonymity_protected_percentage, col=rainbow(length(anonymity_protected_count))
    main="Pie Chart of Anonymity Mental Health Protection")
```

Pie Chart of Anonymity Mental Health Protection



```
n=table(maindata$medical_leave_easy)
n
```

```
##
##      Don't know Somewhat difficult      Somewhat easy
##      286          59          114
##      Very difficult      Very easy
##      47          82
```

```
str(n)
```

```
## 'table' int [1:5(1d)] 286 59 114 47 82
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:5] "Don't know" "Somewhat difficult" "Somewhat easy" "Very difficult" ...
```

```
medical_leave_easy_count<-as.vector(n)
medical_leave_easy_percentage<-names(n)
medical_leave_easy_count
```

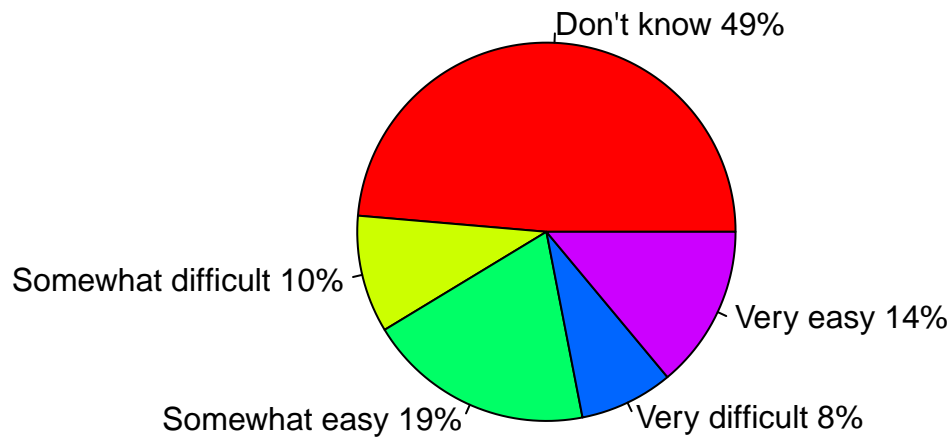
```
## [1] 286 59 114 47 82
```

```
medical_leave_easy_percentage
```

```
## [1] "Don't know"      "Somewhat difficult" "Somewhat easy"
## [4] "Very difficult"  "Very easy"
```

```
pct14 <- round(medical_leave_easy_count/sum(medical_leave_easy_count)*100)
medical_leave_easy_percentage <- paste(medical_leave_easy_percentage, pct14) # add percents to labels
medical_leave_easy_percentage <- paste(medical_leave_easy_percentage,"%",sep="") # ad % to labels
pie(medical_leave_easy_count,labels = medical_leave_easy_percentage, col=rainbow(length(medical_leave_e-
  main="Pie Chart of Whether Medical Leave Easy")
```

Pie Chart of Whether Medical Leave Easy



```
o=table(maindata$mh_negative_consequence_flag)
o
```

```
##
## Maybe      No      Yes
##    244    195    149
```

```
str(o)
```

```
## 'table' int [1:3(1d)] 244 195 149
## - attr(*, "dimnames")=List of 1
##   ..$ : chr [1:3] "Maybe" "No" "Yes"
```

```
mh_negative_consequence_count<-as.vector(o)
mh_negative_consequence_percentage<-names(o)
mh_negative_consequence_count
```

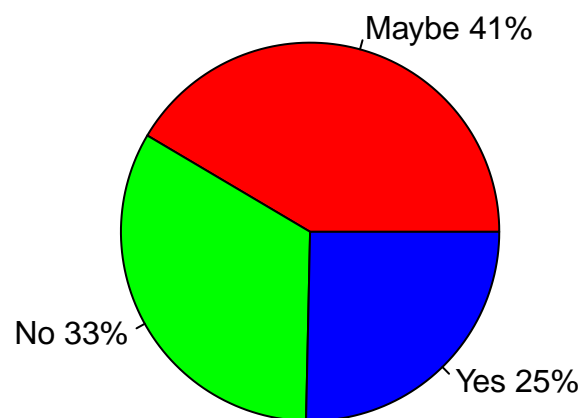
```
## [1] 244 195 149
```

```
mh_negative_consequence_percentage
```

```
## [1] "Maybe" "No"      "Yes"
```

```
pct15 <- round(mh_negative_consequence_count/sum(mh_negative_consequence_count)*100)
mh_negative_consequence_percentage <- paste(mh_negative_consequence_percentage, pct15) # add percents to labels
mh_negative_consequence_percentage <- paste(mh_negative_consequence_percentage,"%",sep="") # add % to labels
pie(mh_negative_consequence_count,labels = mh_negative_consequence_percentage, col=rainbow(length(mh_negative_consequence_count)),
    main="Whether Mental Health have Negative Consequence for Interview")
```

Whether Mental Health have Negative Consequence for Interview



```
p=table(maindata$ph_negative_consequence_flag)
p
```

```
##
## Maybe    No    Yes
##    126   437   25
```

```
str(p)
```

```
## 'table' int [1:3(1d)] 126 437 25
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Maybe" "No" "Yes"
```

```
ph_negative_consequence_flag_count<-as.vector(p)
ph_negative_consequence_flag_percentage<-names(p)
ph_negative_consequence_flag_count
```

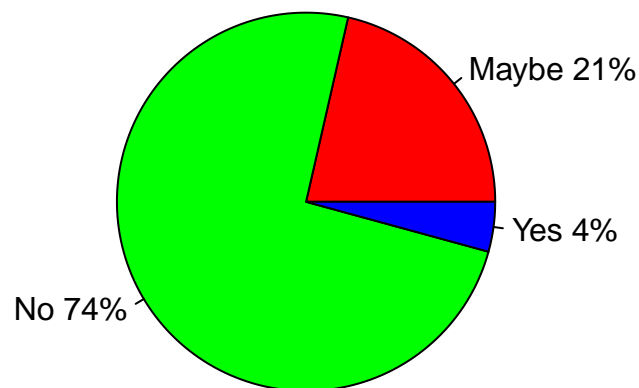
```
## [1] 126 437 25
```

```
ph_negative_consequence_flag_percentage
```

```
## [1] "Maybe" "No" "Yes"
```

```
pct16 <- round(ph_negative_consequence_flag_count/sum(ph_negative_consequence_flag_count)*100)
ph_negative_consequence_flag_percentage <- paste(ph_negative_consequence_flag_percentage, pct16) # add %
ph_negative_consequence_flag_percentage <- paste(ph_negative_consequence_flag_percentage,"%",sep="") # add %
pie(ph_negative_consequence_flag_count,labels = ph_negative_consequence_flag_percentage, col=rainbow(length(ph_negative_consequence_flag_percentage)))
main="Whether Physical Health have Negative Consequence for Interview")
```


Whether Physical Health have Negative Consequence for Interview



```
q=table(maindata$mh_disscuss_coworker)
q
```

```
##
##           No Some of them           Yes
##           123           373           92
```

```
str(q)
```

```
## 'table' int [1:3(1d)] 123 373 92
## - attr(*, "dimnames")=List of 1
##   ..$ : chr [1:3] "No" "Some of them" "Yes"
```

```
mh_disscuss_coworker_count<-as.vector(q)
mh_disscuss_coworker_percentage<-names(q)
mh_disscuss_coworker_count
```

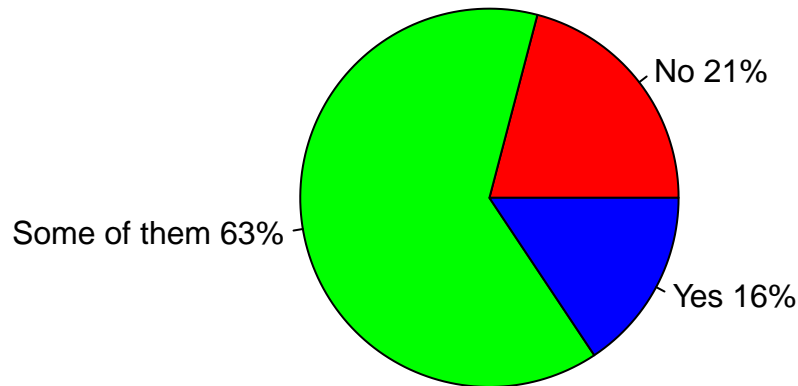
```
## [1] 123 373 92
```

```
mh_disscuss_coworker_percentage
```

```
## [1] "No"           "Some of them" "Yes"
```

```
pct17 <- round(mh_disscuss_coworker_count/sum(mh_disscuss_coworker_count)*100)
mh_disscuss_coworker_percentage <- paste(mh_disscuss_coworker_percentage, pct17) # add percents to labels
mh_disscuss_coworker_percentage <- paste(mh_disscuss_coworker_percentage,"%",sep="") # add % to labels
pie(mh_disscuss_coworker_count,labels = mh_disscuss_coworker_percentage, col=rainbow(length(mh_disscuss_coworker_count)),
    main="Whether Disscuss Mental Health with Coworker")
```

Whether Discuss Mental Health with Coworker



```
r=table(maindata$mh_discuss_supervisor)
r
```

```
##
##          No Some of them          Yes
##          190          176          222
```

```
str(r)
```

```
## 'table' int [1:3(1d)] 190 176 222
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "No" "Some of them" "Yes"
```

```
mh_discuss_supervisor_count<-as.vector(r)
mh_discuss_supervisor_percentage<-names(r)
mh_discuss_supervisor_count
```

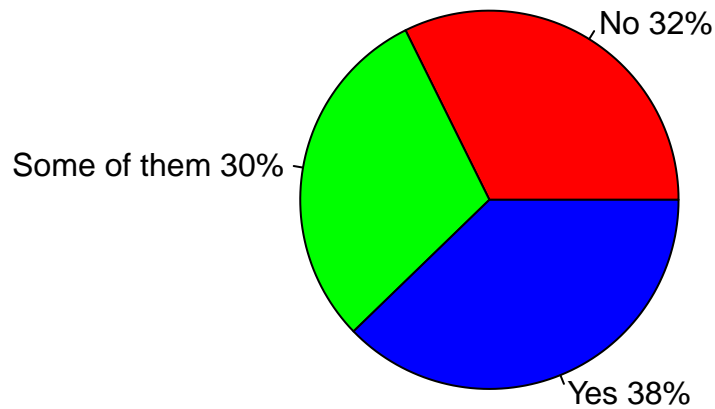
```
## [1] 190 176 222
```

```
mh_discuss_supervisor_percentage
```

```
## [1] "No"          "Some of them" "Yes"
```

```
pct18 <- round(mh_discuss_supervisor_count/sum(mh_discuss_supervisor_count)*100)
mh_discuss_supervisor_percentage <- paste(mh_discuss_supervisor_percentage, pct18) # add percents to
mh_discuss_supervisor_percentage <- paste(mh_discuss_supervisor_percentage,"%",sep="") # ad % to label
pie(mh_discuss_supervisor_count,labels = mh_discuss_supervisor_percentage, col=rainbow(length(mh_discuss_supervisor_count)),
    main="Whether Discuss Mental Health with Supervisor")
```

Whether Discuss Mental Health with Supervisor



```
s=table(maindata$interview_mh_bringup)
s
```

```
##
## Maybe    No    Yes
##    74    502    12
```

```
str(s)
```

```
## 'table' int [1:3(1d)] 74 502 12
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Maybe" "No" "Yes"
```

```
interview_mh_bringup_count<-as.vector(s)
interview_mh_bringup_percentage<-names(s)
interview_mh_bringup_count
```

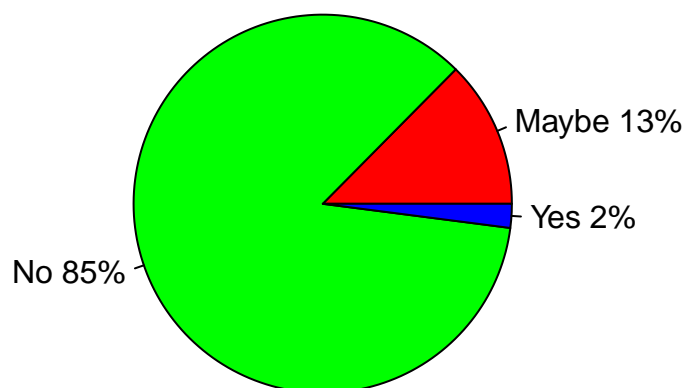
```
## [1] 74 502 12
```

```
interview_mh_bringup_percentage
```

```
## [1] "Maybe" "No" "Yes"
```

```
pct19 <- round(interview_mh_bringup_count/sum(interview_mh_bringup_count)*100)
interview_mh_bringup_percentage <- paste(interview_mh_bringup_percentage, pct19) # add percents to labels
interview_mh_bringup_percentage <- paste(interview_mh_bringup_percentage,"%",sep="") # add % to labels
pie(interview_mh_bringup_count,labels = interview_mh_bringup_percentage, col=rainbow(length(interview_mh_bringup_count)),
    main="Whether Bring Up Mental Health into Interview")
```

Whether Bring Up Mental Health into Interview



```
t=table(maindata$interview_ph_bringup)
t
```

```
##
## Maybe    No    Yes
##   251   262    75
```

```
str(t)
```

```
## 'table' int [1:3(1d)] 251 262 75
## - attr(*, "dimnames")=List of 1
##   ..$ : chr [1:3] "Maybe" "No" "Yes"
```

```
interview_ph_bringup_count<-as.vector(t)
interview_ph_bringup_percentage<-names(t)
interview_ph_bringup_count
```

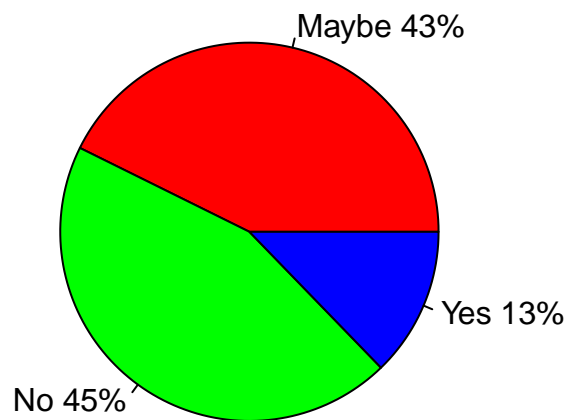
```
## [1] 251 262 75
```

```
interview_ph_bringup_percentage
```

```
## [1] "Maybe" "No"      "Yes"
```

```
pct20 <- round(interview_ph_bringup_count/sum(interview_ph_bringup_count)*100)
interview_ph_bringup_percentage <- paste(interview_ph_bringup_percentage, pct20) # add percents to labels
interview_ph_bringup_percentage <- paste(interview_ph_bringup_percentage,"%",sep="") # add % to labels
pie(interview_ph_bringup_count,labels = interview_ph_bringup_percentage, col=rainbow(length(interview_ph_bringup_count)),
    main="Whether Discuss Physical Health with Coworker")
```

Whether Discuss Physical Health with Coworker



```
u=table(maindata$mh_serious_ph)
u
```

```
##
## Don't know      No      Yes
##      275      158      155
```

```
str(u)
```

```
## 'table' int [1:3(1d)] 275 158 155
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:3] "Don't know" "No" "Yes"
```

```
mh_serious_ph_count<-as.vector(u)
mh_serious_ph_percentage<-names(u)
mh_serious_ph_count
```

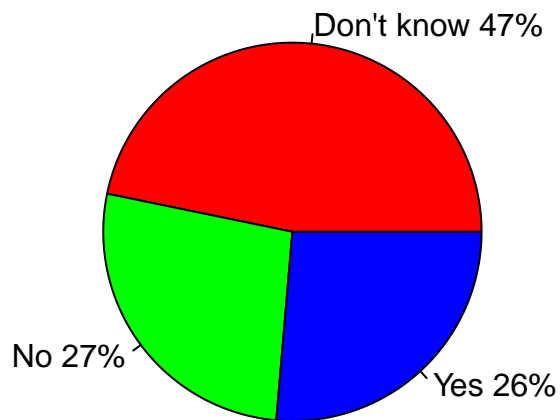
```
## [1] 275 158 155
```

```
mh_serious_ph_percentage
```

```
## [1] "Don't know" "No"      "Yes"
```

```
pct21 <- round(mh_serious_ph_count/sum(mh_serious_ph_count)*100)
mh_serious_ph_percentage <- paste(mh_serious_ph_percentage, pct21) # add percents to labels
mh_serious_ph_percentage <- paste(mh_serious_ph_percentage,"%",sep="") # ad % to labels
pie(mh_serious_ph_count,labels = mh_serious_ph_percentage, col=rainbow(length(mh_serious_ph_percentage))
    main="Mental Health vs. Physical Health")
```

Mental Health vs. Physical Health



```
v=table(maindata$witness_mh_nc)
v
```

```
##
##  No Yes
## 509  79
```

```
str(v)
```

```
## 'table' int [1:2(1d)] 509 79
## - attr(*, "dimnames")=List of 1
## ..$ : chr [1:2] "No" "Yes"
```

```
witness_mh_nc_count<-as.vector(v)
witness_mh_nc_percentage<-names(v)
witness_mh_nc_count
```

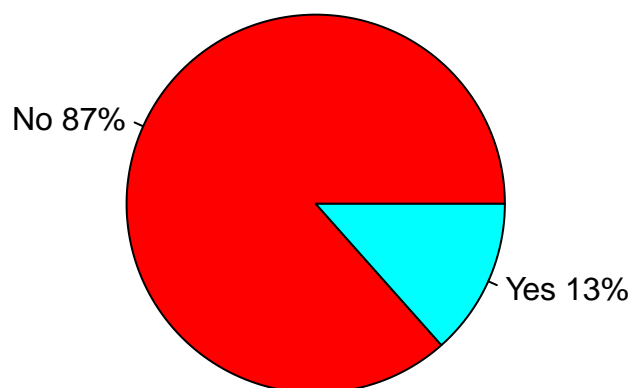
```
## [1] 509  79
```

```
witness_mh_nc_percentage
```

```
## [1] "No" "Yes"
```

```
pct22 <- round(witness_mh_nc_count/sum(witness_mh_nc_count)*100)
witness_mh_nc_percentage <- paste(witness_mh_nc_percentage, pct22) # add percents to labels
witness_mh_nc_percentage <- paste(witness_mh_nc_percentage, "%", sep="") # ad % to labels
pie(witness_mh_nc_count, labels = witness_mh_nc_percentage, col=rainbow(length(witness_mh_nc_percentage)),
    main="Whether Witness the Mental Health Negative Consequence")
```

Whether Witness the Mental Health Negative Consequence



Encoding Data

```
#Make a copy to make us life easier and could use the categorical dataset when we need  
dummydata<-maindata
```

```
#Give numbers for those variable could have a order  
dummydata$age=  
  ifelse(dummydata$age<=20,1,  
    ifelse(dummydata$age>20 & dummydata$age<=40 ,2,  
      ifelse(dummydata$age>40 & dummydata$age<=60,3,4)))  
dummydata$self_employed<-ifelse(dummydata$self_employed=="Yes", 1,0)  
dummydata$family_history<-ifelse(dummydata$family_history=="Yes", 1,0)  
dummydata$mh_treatment<-ifelse(dummydata$mh_treatment=="Yes", 1,0)  
dummydata$interfere=  
  ifelse(dummydata$interfere=='Never',1,  
    ifelse(dummydata$interfere=='Rarely',2,  
      ifelse(dummydata$interfere=="Sometimes",3,4)))  
dummydata$company_size=  
  ifelse(dummydata$company_size=='1-5',1,  
    ifelse(dummydata$company_size=='6-25',2,  
      ifelse(dummydata$company_size=="26-100",3,  
        ifelse(dummydata$company_size=="100-500",4,  
          ifelse(dummydata$company_size=="500-1000",5,6)))))  
dummydata$remote<-ifelse(dummydata$remote=="Yes", 1,0)  
dummydata$tech_company<-ifelse(dummydata$tech_company=="Yes", 1,0)  
dummydata$mh_negative_consequence_flag=  
  ifelse(dummydata$mh_negative_consequence_flag=='No',0,  
    ifelse(dummydata$mh_negative_consequence_flag=='Maybe',1,2))  
dummydata$ph_negative_consequence_flag=  
  ifelse(dummydata$ph_negative_consequence_flag=='No',0,  
    ifelse(dummydata$ph_negative_consequence_flag=='Maybe',1,2))  
dummydata$mh_disscuss_coworker=  
  ifelse(dummydata$mh_disscuss_coworker=='No',0,  
    ifelse(dummydata$mh_disscuss_coworker=='Some of them',1,2))  
dummydata$mh_disscuss_supervisor=  
  ifelse(dummydata$mh_disscuss_supervisor=='No',0,
```

```

        ifelse(dummydata$mh_disscuss_supervisor=='Some of them',1,2))
dummydata$interview_mh_bringup=
  ifelse(dummydata$interview_mh_bringup=='No',0,
    ifelse(dummydata$interview_mh_bringup=='Maybe',1,2))
dummydata$interview_ph_bringup=
  ifelse(dummydata$interview_ph_bringup=='No',0,
    ifelse(dummydata$interview_ph_bringup=='Maybe',1,2))
dummydata$witness_mh_nc<-ifelse(dummydata$witness_mh_nc=="Yes", 1,0)

```

```
skim(dummydata)
```

```

## Skim summary statistics
##  n obs: 588
##  n variables: 24
##
## -- Variable type:character -----
##      variable missing complete  n min max empty n_unique
##  anonymity_protected      0    588 588   2  10     0         3
##  awareness_mh_benefits      0    588 588   2   8     0         3
##  gender                     0    588 588   1   1     0         3
##  medical_leave_easy         0    588 588   9  18     0         5
##  mh_benefits                 0    588 588   2  10     0         3
##  mh_discuss                  0    588 588   2  10     0         3
##  mh_resources                0    588 588   2  10     0         3
##  mh_serious_ph               0    588 588   2  10     0         3
##  state                       0    588 588   2   2     0        43
##
## -- Variable type:numeric -----
##      variable missing complete  n mean  sd p0 p25 p50
##  age                0    588 588 2.14  0.4  1  2  2
##  company_size        0    588 588 3.7   1.74 1  2  3
##  family_history      0    588 588 0.5   0.5  0  0 0.5
##  interfere            0    588 588 2.54  0.96 1  2  3
##  interview_mh_bringup 0    588 588 0.17  0.42 0  0  0
##  interview_ph_bringup 0    588 588 0.68  0.69 0  0  1
##  mh_disscuss_coworker 0    588 588 0.95  0.6  0  1  1
##  mh_disscuss_supervisor 0    588 588 1.05  0.84 0  0  1
##  mh_negative_consequence_flag 0    588 588 0.92  0.76 0  0  1
##  mh_treatment        0    588 588 0.67  0.47 0  0  1
##  ph_negative_consequence_flag 0    588 588 0.3   0.54 0  0  0
##  remote              0    588 588 0.31  0.46 0  0  0
##  self_employed        0    588 588 0.082 0.27 0  0  0
##  tech_company          0    588 588 0.82  0.38 0  1  1
##  witness_mh_nc        0    588 588 0.13  0.34 0  0  0
##  p75 p100    hist
##    2    4
##    6    6
##    1    1
##    3    4
##    0    2
##    1    2
##    1    2
##    2    2

```



```
##      2      2
##      1      1
##      1      2
##      1      1
##      0      1
##      1      1
##      0      1
```

```
#use this for some variable include "I don't know" or "Not sure" and for variable "gender"
dummydata<-dummy_cols(dummydata, select_columns = c("anonymity_protected", "awareness_mh_benefits", "gender"))
```

```
#after adding dummies, remove original categorical variables
dummydata <- dummydata[-c(2,11:17,23)]
```

```
#We would try with state dummies or delete state when we do linear regression
dummydata<-dummy_cols(dummydata, select_columns = c("state"))
```

```
#leave numeric variables and all dummies with state as dummies
dummydata<-dummydata[-2]
dim(dummydata)
```

```
## [1] 588 83
```

```
names(dummydata)
```

```
## [1] "age"
## [2] "self_employed"
## [3] "family_history"
## [4] "mh_treatment"
## [5] "interfere"
## [6] "company_size"
## [7] "remote"
## [8] "tech_company"
## [9] "ph_negative_consequence_flag"
## [10] "mh_disscuss_coworker"
## [11] "mh_disscuss_supervisor"
## [12] "interview_mh_bringup"
## [13] "interview_ph_bringup"
## [14] "witness_mh_nc"
## [15] "anonymity_protected_Yes"
## [16] "anonymity_protected_No"
## [17] "anonymity_protected_Don't know"
## [18] "awareness_mh_benefits_Not sure"
## [19] "awareness_mh_benefits_Yes"
## [20] "awareness_mh_benefits_No"
## [21] "gender_M"
## [22] "gender_F"
## [23] "gender_T"
## [24] "medical_leave_easy_Very easy"
## [25] "medical_leave_easy_Somewhat difficult"
## [26] "medical_leave_easy_Don't know"
## [27] "medical_leave_easy_Somewhat easy"
```

```

## [28] "medical_leave_easy_Very difficult"
## [29] "mh_benefits_Yes"
## [30] "mh_benefits_No"
## [31] "mh_benefits_Don't know"
## [32] "mh_discuss_Yes"
## [33] "mh_discuss_No"
## [34] "mh_discuss_Don't know"
## [35] "mh_resources_Don't know"
## [36] "mh_resources_No"
## [37] "mh_resources_Yes"
## [38] "mh_serious_ph_Yes"
## [39] "mh_serious_ph_No"
## [40] "mh_serious_ph_Don't know"
## [41] "state_MD"
## [42] "state_NY"
## [43] "state_NC"
## [44] "state_MA"
## [45] "state_IA"
## [46] "state_CA"
## [47] "state_TN"
## [48] "state_OH"
## [49] "state_PA"
## [50] "state_WA"
## [51] "state_WI"
## [52] "state_TX"
## [53] "state_IN"
## [54] "state_IL"
## [55] "state_UT"
## [56] "state_OR"
## [57] "state_FL"
## [58] "state_MN"
## [59] "state_MO"
## [60] "state_AZ"
## [61] "state_CT"
## [62] "state_GA"
## [63] "state_NE"
## [64] "state_WV"
## [65] "state_OK"
## [66] "state_MI"
## [67] "state_KS"
## [68] "state_NH"
## [69] "state_KY"
## [70] "state_AL"
## [71] "state_VA"
## [72] "state_CO"
## [73] "state_SC"
## [74] "state_SD"
## [75] "state_NV"
## [76] "state_NJ"
## [77] "state_ID"
## [78] "state_MS"
## [79] "state_WY"
## [80] "state_LA"
## [81] "state_DC"

```

```
## [82] "state_ME"
## [83] "state_VT"
```

```
#leave numeric variables and all dummies with state as dummies
dummydata2<-dummydata[-c(41:83)]
dim(dummydata2)
```

```
## [1] 588 40
```

```
names(dummydata2)
```

```
## [1] "age"
## [2] "self_employed"
## [3] "family_history"
## [4] "mh_treatment"
## [5] "interfere"
## [6] "company_size"
## [7] "remote"
## [8] "tech_company"
## [9] "ph_negative_consequence_flag"
## [10] "mh_disscuss_coworker"
## [11] "mh_disscuss_supervisor"
## [12] "interview_mh_bringup"
## [13] "interview_ph_bringup"
## [14] "witness_mh_nc"
## [15] "anonymity_protected_Yes"
## [16] "anonymity_protected_No"
## [17] "anonymity_protected_Don't know"
## [18] "awareness_mh_benefits_Not sure"
## [19] "awareness_mh_benefits_Yes"
## [20] "awareness_mh_benefits_No"
## [21] "gender_M"
## [22] "gender_F"
## [23] "gender_T"
## [24] "medical_leave_easy_Very easy"
## [25] "medical_leave_easy_Somewhat difficult"
## [26] "medical_leave_easy_Don't know"
## [27] "medical_leave_easy_Somewhat easy"
## [28] "medical_leave_easy_Very difficult"
## [29] "mh_benefits_Yes"
## [30] "mh_benefits_No"
## [31] "mh_benefits_Don't know"
## [32] "mh_discuss_Yes"
## [33] "mh_discuss_No"
## [34] "mh_discuss_Don't know"
## [35] "mh_resources_Don't know"
## [36] "mh_resources_No"
## [37] "mh_resources_Yes"
## [38] "mh_serious_ph_Yes"
## [39] "mh_serious_ph_No"
## [40] "mh_serious_ph_Don't know"
```