

visualizations

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```
library(tidyverse)
library(ggplot2)
```

```
closure <- read_csv("closure.csv")
closure <- closure[-(219:228),]
closure$`Income Group` <- factor(closure$`Income Group`, levels = c("High income", "Upper middle income", "Lower middle income", "Low income"))
closure$Online <- factor(closure$Online)
dates <- read_csv("Dates.csv")
reopening <- read_csv("reopening.csv")
cases <- read_csv("owid-covid-data.csv")
cases <- cases[, -c(17:44, 52:59)]
```

```
summaries <- closure %>%
  group_by(`Income Group`) %>%
  summarize(case_mean = mean(`Number of confirmed cases at time of closure`, na.rm=T), weeks_closed = mean(`Total weeks closed`, na.rm=T))
```

```
## `summarise()` ungrouping output (override with `.groups` argument)
```

```
summaries
```

```
## # A tibble: 4 x 5
##   `Income Group`    case_mean weeks_closed reopening_case online
##   <fct>            <dbl>      <dbl>         <dbl>   <int>
## 1 High income      67.6        14.2        35024.     67
## 2 Upper middle income 39.8        22.6       153555     50
## 3 Lower middle income 14.7        19.3       159021     37
## 4 Low income       4.46        20.4        9290.     16
```

```
closure$`Existing Cash Transfer Supplemented?`[is.na(closure$`Existing Cash Transfer Supplemented?`)] <- "No"
closure$`Plans for Special Education? (Y/N)`[is.na(closure$`Plans for Special Education? (Y/N)`)] <- "No"
```

```
closure %>%
  group_by(`Existing Cash Transfer Supplemented?`) %>%
  summarize(Online = mean(Online == "Yes", na.rm=T), `Not Online` = mean(Online == "No", na.rm=T))
```

```
## `summarise()` ungrouping output (override with `.groups` argument)
```

```
## # A tibble: 2 x 3
##   `Existing Cash Transfer Supplemented?` Online `Not Online`
##   <chr>                                <dbl>      <dbl>
## 1 No                                  0.836        0
## 2 Yes                                0.970        0
```

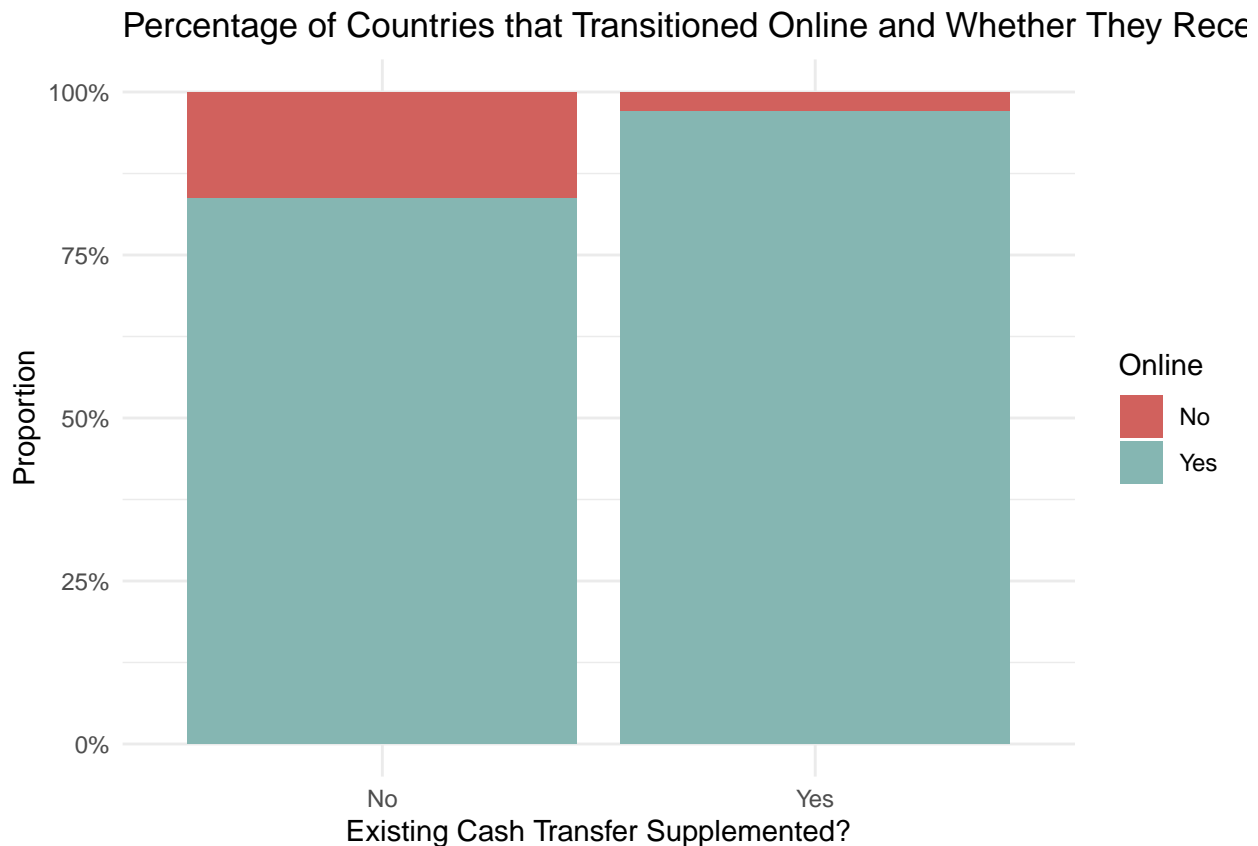
```
a <- closure %>%
  ggplot(aes(`Existing Cash Transfer Supplemented?`, `Total Weeks closed`)) +
  geom_point() +
```

```

#geom_smooth(method="lm", aes(color="Lm")) +
stat_summary(fun=mean, geom="line", aes(group = 1, color = "Mean")) +
scale_colour_manual(values = c("#D1615D", "#85B6B2")) +
theme_minimal() +
labs(title = "The Mean of Countries with Funds Supplemented and Countries without", color = NULL)

closure %>%
  group_by(`Existing Cash Transfer Supplemented?`) %>%
  filter(!is.na(`Online`)) %>%
  count(Online) %>%
  mutate(Proportion = n) %>%
  ggplot(aes(`Existing Cash Transfer Supplemented?`, Proportion, fill=Online)) +
  scale_fill_manual(values = c("#D1615D", "#85B6B2")) +
  geom_col(position='fill') +
  scale_y_continuous(labels = scales::percent) +
  theme_minimal() +
  #geom_label(aes(label = percent(percent)), position = "fill", color = "white", vjust = 1, show.legend = FALSE) +
  #scale_y_continuous(labels = count) +
  #geom_smooth(method="lm", aes(color="Lm")) +
  #stat_summary(fun=mean, geom="line", aes(group = 1, color = "Mean")) +
  #scale_colour_manual(values = c("red", "blue")) +
  labs(title = "Percentage of Countries that Transitioned Online and Whether They Received Supplemental")

```



```

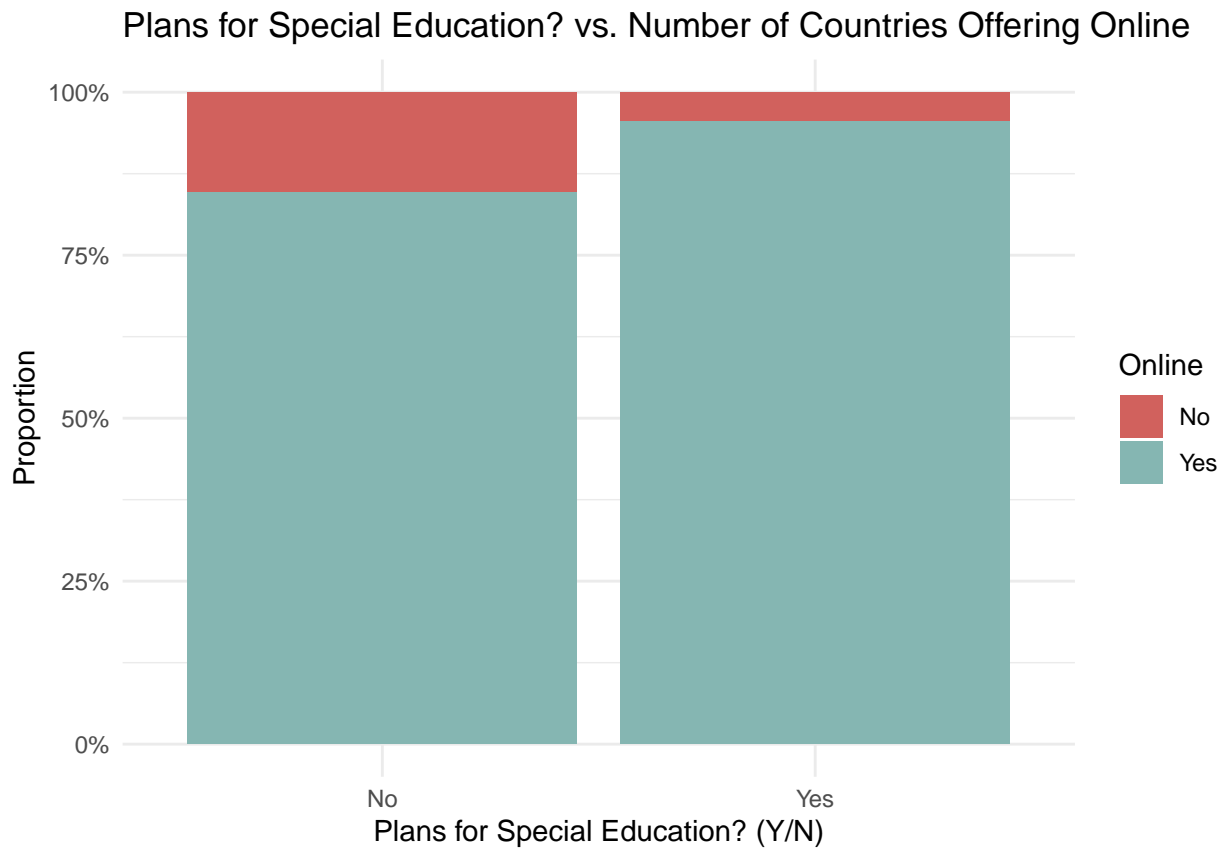
closure %>%
  group_by(`Plans for Special Education? (Y/N)`) %>%
  filter(!is.na(`Online`)) %>%
  count(Online) %>%

```

```

mutate(Proportion = n) %>%
ggplot(aes(`Plans for Special Education? (Y/N)`, Proportion, fill=Online)) +
scale_fill_manual(values = c("#D1615D", "#85B6B2")) +
scale_y_continuous(labels = scales::percent) +
geom_col(position='fill') +
theme_minimal() +
#geom_label(aes(label = percent(percent)), position = "fill", color = "white", vjust = 1, show.legend = FALSE) +
#scale_y_continuous(labels = count) +
#geom_smooth(method="lm", aes(color="Lm")) +
#stat_summary(fun=mean, geom="line", aes(group = 1, color = "Mean")) +
#scale_colour_manual(values = c("red", "blue")) +
labs(title = "Plans for Special Education? vs. Number of Countries Offering Online", color = NULL)

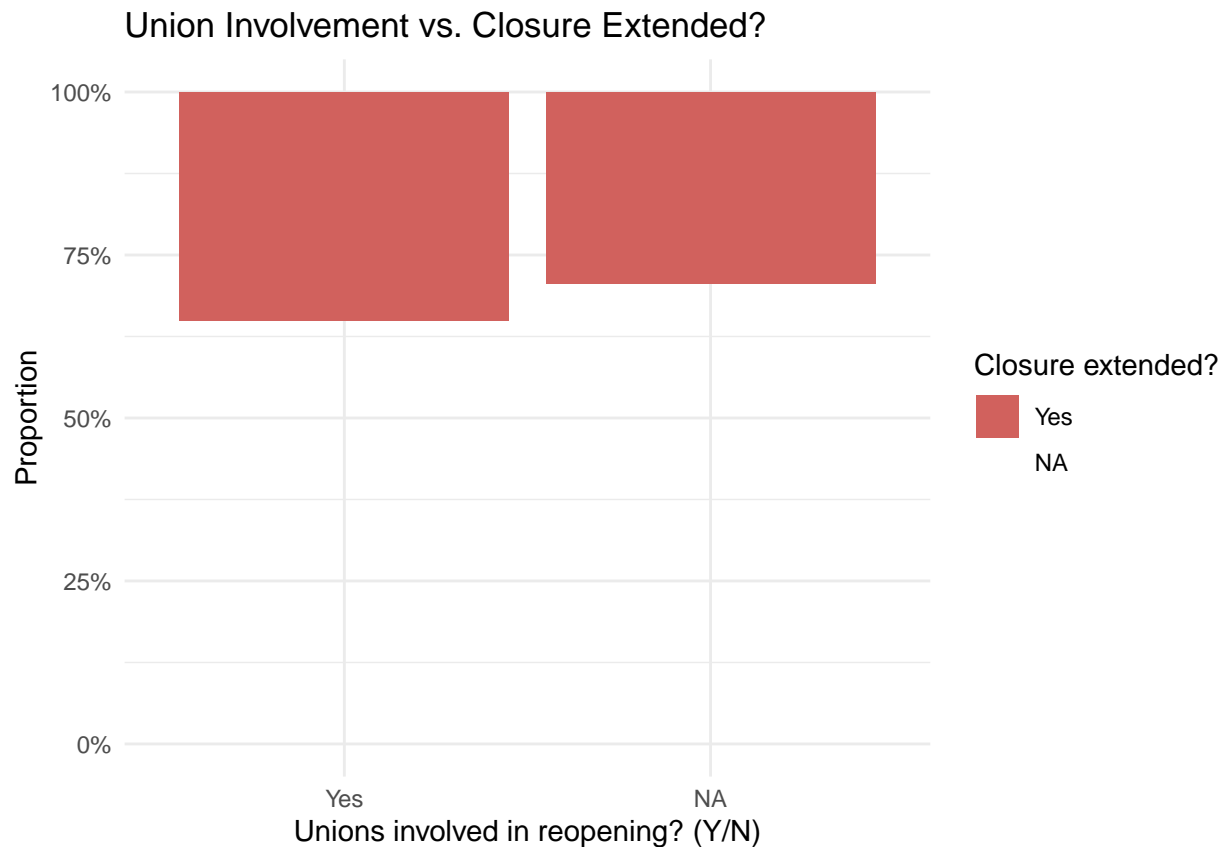
```



```

reopening %>%
group_by(`Unions involved in reopening? (Y/N)`) %>%
count(`Closure extended?`) %>%
mutate(Proportion = n) %>%
ggplot(aes(`Unions involved in reopening? (Y/N)`, Proportion, fill=`Closure extended?`)) +
scale_fill_manual(values = c("#D1615D", "#85B6B2")) +
scale_y_continuous(labels = scales::percent) +
geom_col(position='fill') +
theme_minimal() +
labs(title= "Union Involvement vs. Closure Extended?")

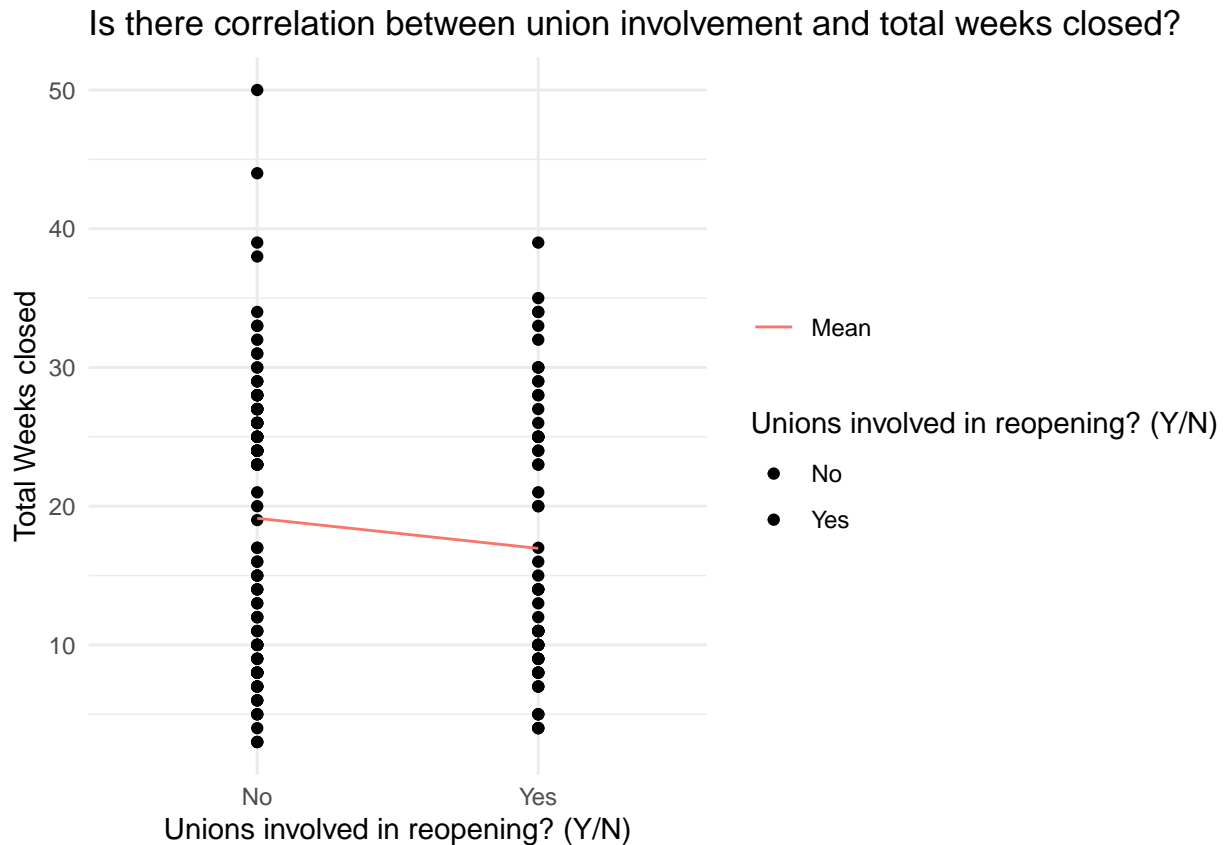
```



```
reopening$`Unions involved in reopening? (Y/N)`[is.na(reopening$`Unions involved in reopening? (Y/N)`)]
reopening$`Closure extended?`[is.na(reopening$`Closure extended?`)] <- "No"

reopening %>%
  #group_by(`Unions involved in reopening? (Y/N)`) %>%
  ggplot(aes(`Unions involved in reopening? (Y/N)`, `Total Weeks closed`, fill=`Unions involved in reopening? (Y/N)`,
    geom_point() +
    #geom_label(aes(label = percent(percent)), position = "fill", color = "white", vjust = 1, show.legend = FALSE)) +
    #scale_y_continuous(labels = count) +
    #geom_smooth(method="lm", aes(color="Lm")) +
    stat_summary(fun=mean, geom="line", aes(group = 1, color = "Mean")) +
    theme_minimal() +
    #scale_colour_manual(values = c("red", "blue")) +
    labs(title = "Is there correlation between union involvement and total weeks closed?", color = NULL))

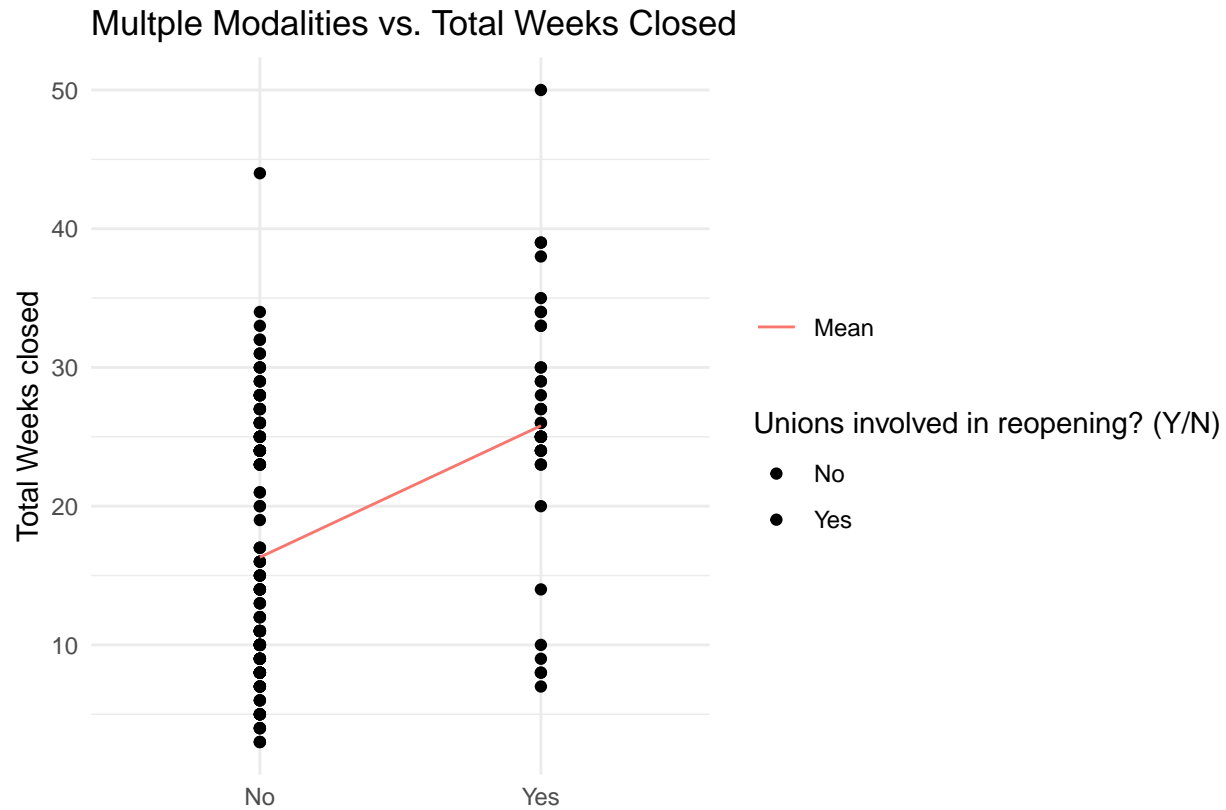
## Warning: Removed 33 rows containing non-finite values (stat_summary).
## Warning: Removed 33 rows containing missing values (geom_point).
```



```
reopening$`Reopening includes multiple modalities? (i.e., online and in-person) Y/N`[is.na(reopening$`Reopening includes multiple modalities? (i.e., online and in-person) Y/N`) == FALSE]
reopening %>%
  #group_by(`Unions involved in reopening? (Y/N)`) %>%
  ggplot(aes(`Reopening includes multiple modalities? (i.e., online and in-person) Y/N`, `Total Weeks Closed`)) +
  geom_point() +
  theme_minimal() +
  #geom_label(aes(label = percent(percent)), position = "fill", color = "white", vjust = 1, show.legend = FALSE) +
  #scale_y_continuous(labels = count) +
  #geom_smooth(method="lm", aes(color="Lm")) +
  stat_summary(fun=mean, geom="line", aes(group = 1, color = "Mean")) +
  #scale_colour_manual(values = c("red", "blue")) +
  labs(title = "Multiple Modalities vs. Total Weeks Closed", color = NULL)
```

Warning: Removed 33 rows containing non-finite values (stat_summary).

Warning: Removed 33 rows containing missing values (geom_point).



ening includes multiple modalities? (i.e., online and in-person) Y/N

```
closure %>%
  group_by(`Existing Cash Transfer Supplemented?`) %>%
  summarize(mean = mean(`Total Weeks closed`, na.rm=T))

## `summarise()` ungrouping output (override with `.groups` argument)
## # A tibble: 2 x 2
##   `Existing Cash Transfer Supplemented?` mean
##   <chr>                                <dbl>
## 1 No                                  17.8
## 2 Yes                                 21.6

reopenY <- reopening %>%
  filter(`Unions involved in reopening? (Y/N)`=='Yes')
reopenN <- reopening %>%
  filter(`Unions involved in reopening? (Y/N)`=='No')
t.test(reopenY$`Total Weeks closed`, reopenN$`Total Weeks closed`, alternative="less")

##
## Welch Two Sample t-test
##
## data: reopenY$`Total Weeks closed` and reopenN$`Total Weeks closed`
## t = -1.4965, df = 151.41, p-value = 0.06831
## alternative hypothesis: true difference in means is less than 0
## 95 percent confidence interval:
##      -Inf 0.2296612
## sample estimates:
## mean of x mean of y
```

```
## 16.95775 19.12605
```

```
#plot(closeDurVSunions)
```

```
closure1 <- closure
closure1$Online <- as.numeric(closure1$Online)
incomeVSONline<- lm(`Online`~`Income Group`, data=closure1)
summary(incomeVSONline)
```

```
##
## Call:
## lm(formula = Online ~ `Income Group`, data = closure1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -0.95714  0.04286  0.10714  0.15909  0.42857
##
## Coefficients:
##                  Estimate Std. Error t value Pr(>|t|)
## (Intercept)          1.95714     0.03930  49.803 < 2e-16 ***
## `Income Group`Upper middle income -0.06429     0.05895  -1.091  0.2768
## `Income Group`Lower middle income -0.11623     0.06326  -1.838  0.0677 .
## `Income Group`Low income          -0.38571     0.07352  -5.246 4.04e-07 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.3288 on 194 degrees of freedom
## (20 observations deleted due to missingness)
## Multiple R-squared:  0.1276, Adjusted R-squared:  0.1141
## F-statistic: 9.461 on 3 and 194 DF,  p-value: 7.291e-06
```

```
#plot(incomeVSONline)
```

```
closure$`Sending work home with students / providing hardcopies of materials`[is.na(closure$`Sending work home with students / providing hardcopies of materials`)]
```

```
closeDurVSprovisions <- lm(`Total Weeks closed`~`Sending work home with students / providing hardcopies of materials`, data=closure)
summary(closeDurVSprovisions)
```

```
##
## Call:
## lm(formula = `Total Weeks closed` ~ `Sending work home with students / providing hardcopies of materials`, data = closure)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -18.9000  -8.4562  -0.9563   7.5437  27.1000
##
## Coefficients:
##                  Estimate
## (Intercept)          17.4563
## `Sending work home with students / providing hardcopies of materials`Yes  5.4437
##
## Std. Error
## (Intercept)          0.7589
## `Sending work home with students / providing hardcopies of materials`Yes  1.9098
```

```
## t value
## (Intercept) 23.00
## `Sending work home with students / providing hardcopies of materials`Yes 2.85
## Pr(>|t|)
## (Intercept) < 2e-16
## `Sending work home with students / providing hardcopies of materials`Yes 0.00485
##
## (Intercept) ***
## `Sending work home with students / providing hardcopies of materials`Yes **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 9.599 on 188 degrees of freedom
## (28 observations deleted due to missingness)
## Multiple R-squared:  0.04143, Adjusted R-squared:  0.03633
## F-statistic: 8.125 on 1 and 188 DF, p-value: 0.004853

#plot(closeDurVSprovisions)

closeDurVScash <- lm(`Total Weeks closed` ~ `Existing Cash Transfer Supplemented?`, data=closure)
summary(closeDurVScash)

##
## Call:
## lm(formula = `Total Weeks closed` ~ `Existing Cash Transfer Supplemented?`,
## data = closure)
##
## Residuals:
## Min 1Q Median 3Q Max
## -14.843 -8.843 -1.343 7.157 32.157
##
## Coefficients:
## Estimate Std. Error t value Pr(>|t|)
## (Intercept) 17.8434 0.7548 23.641 <2e-16
## `Existing Cash Transfer Supplemented?`Yes 3.7400 2.1236 1.761 0.0798
##
## (Intercept) ***
## `Existing Cash Transfer Supplemented?`Yes .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 9.724 on 188 degrees of freedom
## (28 observations deleted due to missingness)
## Multiple R-squared:  0.01623, Adjusted R-squared:  0.011
## F-statistic: 3.102 on 1 and 188 DF, p-value: 0.07984

#plot(closeDurVScash)

reopening1 <- reopening %>%
  inner_join(closure, by="Country")
reopening1$`Income Group.x` <- factor(reopening1$`Income Group.x`)
reopening1$`Existing Cash Transfer Supplemented?` <- factor(reopening1$`Existing Cash Transfer Supplemented?`)
reopening1$`Unions involved in reopening? (Y/N)` <- factor(reopening1$`Unions involved in reopening? (Y/N)`)
mfull <- lm(`Total Weeks closed.x` ~ `Income Group.x` + `Unions involved in reopening? (Y/N)` + `Existing Cash Transfer Supplemented?`, data=reopening1)
mreduced <- lm(`Total Weeks closed.x` ~ `Income Group.x` + `Unions involved in reopening? (Y/N)`, data=reopening1)
```



```
anova(mreduced, mfull)
```

```
## Analysis of Variance Table
##
## Model 1: `Total Weeks closed.x` ~ `Income Group.x` + `Unions involved in reopening? (Y/N)`
## Model 2: `Total Weeks closed.x` ~ `Income Group.x` + `Unions involved in reopening? (Y/N)` +
##   `Existing Cash Transfer Supplemented?`
##   Res.Df    RSS Df Sum of Sq    F Pr(>F)
## 1      184 15583
## 2      183 15551   1    31.982 0.3764 0.5403
```

```
anova(mfull)
```

```
## Analysis of Variance Table
##
## Response: Total Weeks closed.x
##
##               Df Sum Sq Mean Sq F value    Pr(>F)
## `Income Group.x`      3  2255.9   751.97   8.8491 1.654e-05
## `Unions involved in reopening? (Y/N)` 1    95.0    94.96   1.1174 0.2919
## `Existing Cash Transfer Supplemented?` 1    32.0    31.98   0.3764 0.5403
## Residuals              183 15550.9    84.98
##
## `Income Group.x`      ***
## `Unions involved in reopening? (Y/N)`
## `Existing Cash Transfer Supplemented?`
## Residuals
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
anova(mreduced)
```

```
## Analysis of Variance Table
##
## Response: Total Weeks closed.x
##
##               Df Sum Sq Mean Sq F value    Pr(>F)
## `Income Group.x`      3  2255.9   751.97   8.8792 1.586e-05 ***
## `Unions involved in reopening? (Y/N)` 1    95.0    94.96   1.1212 0.291
## Residuals              184 15582.9    84.69
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
summary(mfull)
```

```
##
## Call:
## lm(formula = `Total Weeks closed.x` ~ `Income Group.x` + `Unions involved in reopening? (Y/N)` +
##   `Existing Cash Transfer Supplemented?`, data = reopening1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -17.5220  -6.8333  -0.7305   6.8531  30.3609
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      14.730       1.238   11.901  < 2e-16
## `Income Group.x`Low income      6.062       2.080    2.915  0.00400
```

```
## `Income Group.x`Lower middle income      4.909      1.822      2.694  0.00772
## `Income Group.x`Upper middle income      7.792      1.816      4.291 2.88e-05
## `Unions involved in reopening? (Y/N)`Yes -1.492      1.413     -1.056  0.29229
## `Existing Cash Transfer Supplemented?`Yes  1.311      2.138      0.613  0.54032
##
## (Intercept)                                ***
## `Income Group.x`Low income                 **
## `Income Group.x`Lower middle income        **
## `Income Group.x`Upper middle income        ***
## `Unions involved in reopening? (Y/N)`Yes
## `Existing Cash Transfer Supplemented?`Yes
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 9.218 on 183 degrees of freedom
## (28 observations deleted due to missingness)
## Multiple R-squared:  0.1329, Adjusted R-squared:  0.1092
## F-statistic: 5.608 on 5 and 183 DF,  p-value: 7.803e-05
```

```
summary(mreduced)
```

```
##
## Call:
## lm(formula = `Total Weeks closed.x` ~ `Income Group.x` + `Unions involved in reopening? (Y/N)`,
##     data = reopening1)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -17.9048  -6.9048  -0.2914   6.6301  30.1365
##
## Coefficients:
##                                Estimate Std. Error t value Pr(>|t|)
## (Intercept)                   14.785      1.232   11.996 < 2e-16
## `Income Group.x`Low income      6.008      2.074    2.896  0.00423
## `Income Group.x`Lower middle income  5.079      1.798    2.825  0.00526
## `Income Group.x`Upper middle income  8.120      1.732    4.688 5.37e-06
## `Unions involved in reopening? (Y/N)`Yes -1.494      1.411   -1.059  0.29104
##
## (Intercept)                                ***
## `Income Group.x`Low income                 **
## `Income Group.x`Lower middle income        **
## `Income Group.x`Upper middle income        ***
## `Unions involved in reopening? (Y/N)`Yes
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 9.203 on 184 degrees of freedom
## (28 observations deleted due to missingness)
## Multiple R-squared:  0.1311, Adjusted R-squared:  0.1122
## F-statistic:  6.94 on 4 and 184 DF,  p-value: 3.175e-05
```