```
title: "Census Mapping DMV"
author: "Tyler Sanders" date: "November 28, 2018'
output:
 pdf_document: default
 html document: default
```{r setup, include=FALSE}
knitr::opts_chunk$set(echo = TRUE)
###DATA
##Prerequisites
 `{r}
library(modelr)
library(tidyverse)
library(leaflet)
library(tigris)
library(acs)
library(ggplot2)
library(IDPmisc)
library(plotly)
api.key.install("80d68bbbdc19c70a4c2c9f188638956df52d8e87")
##Data Tidying for Commuting in DC
###Mapping with Leaflet & Tigris
##Public Transit Use for Commuting DMV(variable = B08134 061)
 `{r}
MD <- tracts(state = 'MD')
plot(MD)
my_states <- c('MD', 'VA', 'DC')</pre>
dmv <- counties(state = my_states)</pre>
plot(dmv)
where i want <- c("MD", "DC", "VA")
##my_counties <- c("51107", 51177 51179 24003 51600 51510 24017 24009 24031 51013 51153 24037 51069 51610 24021 24510 24027 51059 ##24033 24005
plot(dmv)
dmv <- tracts(state = my_states)</pre>
dmv_ptu_data <- acs.fetch(endyear = 2012,</pre>
 variable ="B08134_061")
dmv ptu df <- data.frame(paste0(as.character(dmv ptu data@geography$state),</pre>
 as.character(dmv_ptu_data@geography$county),
 dmv_ptu_data@geography$tract),
 dmv ptu data@estimate)
colnames(dmv_ptu_df) <- c("GEOID", "use.transit")</pre>
dmv ptu merged <- geo join(dmv, dmv ptu df, "GEOID", "GEOID")
pal <- colorQuantile("Greens", NULL, n = 4)
popup <- paste0("Number of residents who commute using Public Transit: ", as.character(dmv ptu df$use.transit))
map_dmv_ptu <- leaflet() %>%
 addProviderTiles("CartoDB.Positron") %>%
 addPolygons(data = dmv_ptu_merged,
fillColor = ~pal(dmv_ptu_df$use.transit),
 fillOpacity = 0.7,
 weight = 0.2.
 smoothFactor = 0.2,
 popup = popup) %>%
 addLegend(pal = pal,
 values = dmv ptu df$use.transit,
 position = "bottomright",
 title = "DMV Public Transit Use for Commuting")
##Public Transit Use for Commuting Maryland (variable = B08134 061)
MD <- tracts(state = 'MD')
md_ptu_data <- acs.fetch(endyear = 2012,</pre>
 geography = geo.make(state = "MD",
 county = "*",
 tract = "*"),
 variable ="B08134_061")
md_ptu_df <- data.frame(paste0(as.character(md_ptu_data@geography$state),</pre>
 as.character(md_ptu_data@geography$county),
 md_ptu_data@geography$tract),
 md ptu data@estimate)
colnames(md ptu df) <- c("GEOID", "use.transit")</pre>
md_ptu_merged <- geo_join(MD, md_ptu_df, "GEOID", "GEOID")</pre>
pal <- colorNumeric("Greens", NULL, n = 3)
popup <- paste0("Number of residents who commute using Public Transit: ", as.character(md ptu df$use.transit))
map md ptu <- leaflet() %>%
 addProviderTiles("CartoDB.Positron") %>%
 addPolygons(data = md_ptu_merged,
 fillColor = ~pal(md_ptu_df$use.transit),
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fillOpacity = 0.7,
 weight = 0.2,
smoothFactor = 0.2,
 popup = popup) %>%
 addMarkers(lng = -77.017834, lat = 38.975532) %>%
 addLegend(pal = pal,
 values = md_ptu_df$use.transit,
position = "bottomright",
 title = "Maryland Public Transit Use")
map_md_ptu
\verb|##Public Transit Use for Commuting Virginia (variable = B08134_061)|
VA <- tracts(state = 'VA')
plot(VA)
va_ptu_data <- acs.fetch(endyear = 2012,</pre>
 geography = geo.make(state = "VA",
 county = "*",
tract = "*"),
 variable ="B08134_061")
va_ptu_data@geography$tract),
 va ptu data@estimate)
colnames(va_ptu_df) <- c("GEOID", "use.transit")</pre>
va_ptu_merged <- geo_join(VA, va_ptu_df, "GEOID", "GEOID")</pre>
pal <- colorNumeric("Greens", NULL, n = 3)
popup <- paste0("Number of residents who commute using Public Transit: ", as.character(va ptu df$use.transit))
#map_va_ptu <- leaflet() %>%
 addProviderTiles("CartoDB.Positron") %>%
 addPolygons(data = va_ptu_merged,
 fillColor = ~pal(va_ptu_df$use.transit),
fillOpacity = 0.7,
 weight = 0.2,
 smoothFactor = 0.2,
 popup = popup) %>%
 addProviderTiles(providers$Esri.NatGeoWorldMap) %>%
 addCircleMarkers(lat = metro_stops$Y, lng = metro_stops$X, radius = 5, weight = .1, opacity = .1, label = paste0("Metro Stop: ", as.character(metro_stops$NAME),
 '\r\n----\r\n', "\r\n Line: ",
 as.character(metro_stops$LINE))) %>%
 addLegend(pal = pal,
 values = va_ptu_df$use.transit,
 position = "bottomleft",
title = "Virginia Public Transit Use")
###DC Metro Data
 `\{r}
#metro_stops <- Metro_Station_Entrances_Regional</pre>
#metro_bus <- Metro_Bus_Line</pre>
#tmap_md_ptu <- leaflet() %>%
 addProviderTiles("CartoDB.Positron") %>%
 addPolygons(data = md_ptu_merged,
fillColor = ~pal(md_ptu_df$use.transit),
fillOpacity = 0.7,
 weight = 0.2,
 smoothFactor = 0.2,
 popup = popup) %>%
 \verb| addProviderTiles(providers\$Esri.NatGeoWorldMap)| \$>\$
 addCircleMarkers(lat = metro_stops$Y, lng = metro_stops$X, radius = 5, weight = .1, opacity = .1, label = paste0("Metro Stop: ", as.character(metro_stops$NAME), '\r\n----\r\n', "\r\n Line: ",
 as.character(metro_stops$LINE))) %>%
 addLegend(pal = pal,
 values = md_ptu_df$use.transit,
 position = "bottomleft",
 title = "Maryland Public Transit Use")
tmap_md_ptu
?addCircleMarkers
```{r}
##building dataset
testadd_data <- acs.fetch(endyear = 2012,</pre>
                              geography = geo.make(state = (my_states),
                                                       county = "*"),
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variable ="B19013_001") #hhincome
testadd df <- data.frame(paste0(as.character(testadd data@geography$state),
                                           as.character(testadd data@geography$county),
                                     testadd_data@geography$tract),
                             testadd_data@estimate)
colnames(testadd_df) <- c("GEOID", "hhincome")</pre>
dmv_ptu_data
test2 <- left_join(dmv_ptu_df, testadd_df, "GEOID")</pre>
colnames(test2) <- c("GEOID", "usetransit", "hhincome")</pre>
full dmv data <- test2
#Buiding Data
#add new variable repeated
#B02001_001 total population
#B02009_001 Black pop. total
#B03001_003 hispanic or latino total
#B19013_001 household income
#B05010_002 below poverty line
\#B08136\_001 total average travel time
#B08136_007 avg travel time pub trans
#B08134_061 use public transit
#DP03_0021 #percent commuting to work
#DP05_0065 percent latino
##Geode
va <- (51)
plot(va)
#va_tracts <- counties(51, county = "Fairfax County")</pre>
plot(va_tracts)
?tracts
silver counties <- c(059, 013, 107, 510)
va_s <- tracts(state = 51, county = silver_counties)</pre>
##Total Population
add data <- acs.fetch(endyear = 2012,
                              geography = geo.make(state = 51,
                                                     county = silver_counties,
tract = "*"),
                                variable ="B02001_001") #total population
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                           as.character(add_data@geography$county),
                                   add_data@geography$tract),
                            add_data@estimate)
colnames(add_df) <- c("GEOID", "pop12")</pre>
hold <- add_df
hold <- left_join(va_s, add_df, "GEOID")</pre>
data <- hold
###
add_data <- acs.fetch(endyear = 2014,
                              geography = geo.make(state = 51,
                                                 county = silver_counties,
tract = "*"),
                                variable ="B02001_001") #total population
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                           as.character(add data@geography$county),
                                   add_data@geography$tract),
                             add_data@estimate)
colnames(add_df) <- c("GEOID", "pop14")
hold <- left_join(data, add_df, "GEOID")
data <- hold</pre>
add_data <- acs.fetch(endyear = 2016,
                              geography = geo.make(state = 51,
                                                     county = silver_counties,
tract = "*"),
                                variable ="B02001_001") #total population
\verb|add_df| <- data.frame(paste0(as.character(add_data@geography\$state),
                                           as.character(add_data@geography$county),
```

add_data@geography\$tract),

add_data@estimate)

colnames(add_df) <- c("GEOID", "pop16")
hold <- left_join(data, add_df, "GEOID")</pre>

data <- hold

```
### use transit ###
add_data <- acs.fetch(endyear = 2012,</pre>
                                geography = geo.make(state = 51,
                                                 county = silver_counties,
tract = "*"),
                                 variable ="B08134_061") #use transit
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                             as.character(add_data@geography$county),
                                     add_data@geography$tract),
                              add_data@estimate)
colnames(add_df) <- c("GEOID", "transit12")
hold <- left_join(data, add_df, "GEOID")
data <- hold</pre>
add_data <- acs.fetch(endyear = 2014,
                                geography = geo.make(state = 51,
                                                       county = silver_counties,
tract = "*"),
                                 variable ="B08134 061")
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                             as.character(add_data@geography$county),
                                    add_data@geography$tract),
                              add data@estimate)
colnames(add_df) <- c("GEOID", "transit14")
hold <- left_join(data, add_df, "GEOID")</pre>
data <- hold
###
add data <- acs.fetch(endyear = 2016,
                                geography = geo.make(state = 51,
                                                        county = silver_counties,
tract = "*"),
                                 variable ="B08134 061")
\verb| add_df <- data.frame(paste0(as.character(add_data@geography\$state),\\
                                             as.character(add_data@geography$county),
                                     add data@geography$tract),
                              add_data@estimate)
colnames(add_df) <- c("GEOID", "transit16")
hold <- left_join(data, add_df, "GEOID")</pre>
data <- hold
###hhincome###
add_data <- acs.fetch(endyear = 2012,</pre>
                               geography = geo.make(state = 51,
                                                 county = silver_counties,
tract = "*"),
                                 variable ="B19013_001") #hhincome
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                            as.character(add data@geography$county),
                                     add_data@geography$tract),
                             add_data@estimate)
colnames(add_df) <- c("GEOID", "hhincome12")
hold <- left_join(data, add_df, "GEOID")
data <- hold
add data <- acs.fetch(endyear = 2014,
                               geography = geo.make(state = 51,
                                                       county = silver_counties,
tract = "*"),
                                 variable ="B19013_001")
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                             as.character(add_data@geography$county),
                                    add_data@geography$tract),
                              add data@estimate)
colnames(add_df) <- c("GEOID", "hhincome14")
hold <- left_join(data, add_df, "GEOID")
data <- hold</pre>
add_data <- acs.fetch(endyear = 2016,
                                geography = geo.make(state = 51,
                                                       county = silver_counties,
tract = "*"),
                                 variable ="B19013_001")
add_df <- data.frame(paste0(as.character(add_data@geography$state),</pre>
                                     as.character(add_data@geography$county), add_data@geography$tract),
                              add_data@estimate)
colnames(add_df) <- c("GEOID", "hhincome16")
hold <- left_join(data, add_df, "GEOID")
data <- hold</pre>
```

```
###pcttransit###
test <- mutate(hold, pcttransit12 = transit12 / pop12)</pre>
data <- test
test <- mutate(data, pcttransit14 = transit14 / pop14)
data <- test
test <- mutate(data, pcttransit16 = transit16 / pop16)</pre>
data <- test
data$incomegrowth <- ((data$hhincome16 - data$hhincome12) / data$hhincome12)</pre>
silver_income <- data
###gather and tidy###
gt <- test %>% gather(`pcttransit12`, `pcttransit14`, `pcttransit16`, key = "year", value = "pcttransit") #this worked first try!!
\texttt{ready} \leftarrow \texttt{na.exclude(gt)} \ \ \texttt{\#14} \ \ \texttt{obs.} \ \ \texttt{excluded} \ \ \texttt{with NA} \ \ \texttt{in pctransit} \ \ \texttt{as a result of a pop listing of 0.}
ready <- na.exclude(silver_income)</pre>
silver income change$before <- ifelse(silver income change$year == "pcttransit12" | silver income change$year == "pctusetransit14", "before",
silver_income_change$before <- ifelse(silver_income_change$year == "pcttransitiz" | silver_income_change$year -- pctusetlansitin", before,
"after") #after silver line construction == 1
ready$silver <- ifelse(ready$GEOID == "5159471201" | ready$GEOID == "5159482100" | ready$GEOID == "5159480202" | ready$GEOID == "5159482202" |
ready$GEOID == "5159471202" | ready$GEOID == "5159481900" | ready$GEOID == "5159482203" |
ready$GEOID == "5159481202" | ready$GEOID == "5159482201" | ready$GEOID == "5159482302" | ready$GEOID == "5159481400" | ready$GEOID == "5159482301" | ready$GE
##https://www.fairfaxcounty.gov/demographics/interactive-map-block-groups##
\verb|ready\$growth| <- ((ready\$pcttransit16 - ready\$pcttransit12) / ready\$pcttransit12)|
silver_test <- silver
\verb|silver_test\$| \texttt{growth} \gets ((\verb|silver_test\$| \texttt{transit16} - \verb|silver_test\$| \texttt{transit12}) / \verb|silver_test\$| \texttt{transit12}) \\
silver_growth <- silver_test
silver_growth <- ready
silver income <- ready
write.csv(silver growth, 'silver growth.csv')
saveRDS(silver, "silver.R")
load("silver.R")
write.csv(silver,'silver.csv')
silver <- read.csv("silver.csv") #final data for first regression</pre>
silver_growth <- read.csv("silver_growth.csv") #final data for growth regression</pre>
silver_income_change <- read.csv("silver_income.csv")</pre>
silver_income_change <- silver_income_change %>% gather(`pcttransit12`, `pcttransit14`, `pcttransit16`, key = "year", value = "pcttransit")
silver_income_change$income <- ((silver_income_change$hhincome16 - silver_income_change$hhincome12) / silver_income_change$hhincome12 *100)
\verb|silver_income_change\$after <- ifelse(silver_income_change\$year == "pottransit16", 1, 0)|
### heterogenious treatment effects ###
lm <- lm(pcttransit \sim silver + after + silver * after, data = silver)
silver <- silver %>% add_predictions(lm)
summary(lm) # intercept and silver variables significant at 99%
lm silver <- lm
ggplot(silver, aes(lm$fitted.values)) +
    geom_point() +
   geom_abline(aes(lm))
ggplot(data = silver, aes(pop16, pcttransit)) +
   abline(lm(pcttransit ~ silver + after + silver * after, data = silver))
ggplot(data = silver, aes(pcttransit, pred)) +
  geom_smooth(method='lm')
###growth regression###
silver_growth <- NaRV.omit(silver_growth)
sna.omit(silver_growth)
growth_lm <- lm(growth ~ silver + after + silver*after, data = silver_growth)</pre>
silver_growth <- silver_growth %>% add_predictions(growth)
summary(growth)
ggplot(data = silver, aes(pcttransit, pred)) +
  geom_smooth(method='lm') +
   geom point()
plot(lm)
```

```
###income growth regression###
silver_income_lm <- lm(income ~ silver + after + silver*after, data = silver_income_change)</pre>
income_growth <- lm(income ~ silver, data = silver_income)</pre>
summary(income_growth)
silver_income <- silver_income %>% add_predictions(income_growth)
write.csv(silver_income, "silver_income.csv")
###Linear Regressions###
summary(lm_silver)
summary(growth_lm)
summary(silver_income_lm)
```{r}
xlab = "X Axis",
 ylab = "Y Axis",
 main = "Title") +
abline(lm_silver) + #add regression line abline(v = 0, lty = "dashed")
p <- ggplot(silver_income_change, aes(pcttransit, silver, colour=silver)) +</pre>
 geom_point()
 geom_jitter()
p + labs(aesthetic='custom text')
p + scale fill discrete(name= "Test")
color= ifelse(silver_income_change$silver,'Next to Silver Line', 'Control Population')
ggplot(silver_income_change, aes(pcttransit, before, col = silver, "red")) +
 geom_point(col = "black") +
 geom_line(col = "red") +
 geom_jitter() +
 xlab "Percentage of Residents Who Commute with Transit") +
ylab("Difference in Differences post Silver Line Opening") +
 ggtitle("Measuring the Impact of Silver Line Phase 1 on Commuter Behavior"))
ggplot(silver_income_change, aes(pcttransit, before, col = silver, col = "red")) +
 geom_point() +
 geom_line(col = "red") +
 geom_jitter() +
 xlab("Percentage of Residents Who Commute with Transit")
 ylab("Difference in Differences post Silver Line Opening") +
ggtitle("Measuring the Impact of Silver Line Phase 1 on Commuter Behavior")
```