

```

# Packages -----

library(sf)
library(tidyverse)
library(readxl)
library(writexl)

# Load Data -----

# 1. stations

stations <-
  read_csv('DataStory/alt_fuel_stations.csv')

# 2. EV stocks

# stocks

EV_registration_by_state <-
  read_excel('DataStory/ev-registration-counts-by-state.xlsx') %>%
  select(State, `Registration Count`) %>%
  filter(State != 'Total')

# registration

LDV_registration_2021 <-
  read_excel('DataStory/2021_LDV_registration.xlsx') %>%
  filter(State != 'United States')

# 3. Housing and other demography data

DMV_housing_temp <-
  read_xlsx('DataStory/DMV_housing.xlsx')

DMV_housing <-
  t(DMV_housing_temp[-1])

colnames(DMV_housing) <- select(DMV_housing_temp, `vehicles available`)

# basic states information

data(state)

```

```

state <-
  cbind(state.name, state.abb, state.area) %>%
  as_tibble() %>%
  rename(State = state.name,
          abb = state.abb,
          area = state.area)

```

4. laws and incentives

```

EV_law <-
  read_csv('DataStory/EV_law.csv') %>%
  filter(Recent == TRUE,
         State != 'US') %>%
  group_by(State) %>%
  summarise(EV_law = n()) %>%
  rename(state.abb = State)

```

PHEV_law is useless since EV_law overlaps with it

```

PHEV_law <-
  read_csv('DataStory/PHEV_law.csv') %>%
  filter(`Recent?` == TRUE,
         State != 'US') %>%
  group_by(State) %>%
  summarise(PHEV_law = n()) %>%
  rename(state.abb = State)

```

states that have incentives or not

```

state_w_incentive <-
  cbind(state.abb, state.name) %>%
  as_tibble() %>%
  full_join(EV_law) %>%
  full_join(PHEV_law) %>%
  rename(State = state.name,
          abb = state.abb) %>%
  mutate(EV_law_B = if_else(!is.na(EV_law),
                           T,
                           F)) %>%
  mutate(PHEV_law_B = if_else(!is.na(PHEV_law),
                              T,
                              F))

```

Data preparation -----

1. charger number by state

```
charger_by_state <-  
  stations %>%
```

```
# the open date is earlier than 2022, so this is the existence of chargers in  
# 2021
```

```
filter(year(`Open Date`) < 2022) %>%
```

```
# 'ON' is in Canada
```

```
filter(State != 'ON') %>%  
select(`Station Name`, `EV Level1 EVSE Num`, `EV Level2 EVSE Num`,  
       `EV DC Fast Count`, State) %>%
```

```
# 'NA' indicates that there is no this type of EVSE in the station, so there  
# is 0 this type of EVSE in the station
```

```
replace(is.na(.), 0) %>%
```

```
# the total number of charging points in a charging station is the sum of  
# 3 types of EVSEs
```

```
mutate(EVSE = `EV Level1 EVSE Num` + `EV Level2 EVSE Num` +  
       `EV DC Fast Count`) %>%
```

```
# calculate the total number of EVSE in each state in 2021
```

```
group_by(State) %>%  
summarise(EVSE_state = sum(EVSE))
```

2. increase of EV

EV count

```
LDV_2021 <-  
  LDV_registration_2021 %>%  
  transmute(  
    State = State,  
    EV = `Electric (EV)`,  
    PHEV = `Plug-In Hybrid Electric (PHEV)` ) %>%  
  mutate(count = EV + PHEV)
```

```

# percentage increase

EV_percentage <-
  LDV_2021 %>%
  full_join(EV_registration_by_state,
            by = join_by(State)) %>%
  mutate(percent = `Registration Count` / count)

# Increase & charger count -----

# An analysis based on 2021 data

increase_and_charger <-
  charger_by_state %>%
  rename(abb = State) %>%
  full_join(state,
            by = join_by(abb)) %>%
  full_join(EV_percentage,
            by = join_by(State)) %>%

  # combine the DC values into one row, then discard the previous rows
  # containing NA values

  rbind(c('DC', 798, 'District of Columbia', 68, 3700, 2500, 6200, 3700,
          0.596774193548387)) %>%
  na.omit()

# calculate the charger density in each state

increase_and_charger$EVSE_state <- as.numeric(increase_and_charger$EVSE_state)
increase_and_charger$area <- as.numeric(increase_and_charger$area)
increase_and_charger$percent <- as.numeric(increase_and_charger$percent)
increase_and_charger$count <- as.numeric(increase_and_charger$count)

# scatter plot with a fit line

increase_and_charger <-
  increase_and_charger %>%
  mutate(charger_density = EVSE_state / area)

# 1. charger density by area

p1 <-

```

```

increase_and_charger %>%

# exclude the outlier for a better visualization

filter(abb != 'DC') %>%
ggplot(aes(x = charger_density,
           y = percent)) +
geom_point(color = 'gray',
           size = 4) +
stat_smooth(method = 'lm',
           formula = y ~ x,
           se = F,
           color = '#4dac26') +
theme_bw() +
theme(axis.line = element_line(colour = '#969696'),
      axis.ticks = element_blank(),
      panel.grid.minor = element_blank(),
      panel.grid.major = element_line(linetype = 'dashed'),
      panel.border = element_blank())

```

2. charger density by EV count

```

increase_and_charger <-
  increase_and_charger %>%
  mutate(charger_density = EVSE_state / count)

p2 <-
  increase_and_charger %>%

# exclude the outlier for a better visualization

filter(abb != 'DC') %>%
ggplot(aes(x = charger_density,
           y = percent)) +
geom_point(color = 'gray',
           size = 4) +
stat_smooth(method = 'lm',
           formula = y ~ x,
           se = F,
           color = '#4dac26') +
theme_bw() +
theme(axis.line = element_line(colour = '#969696'),
      axis.ticks = element_blank(),
      panel.grid.minor = element_blank(),

```

```
panel.grid.major = element_line(linetype = 'dashed'),
panel.border = element_blank()
```

```
# Scatter plot with 2 fit lines -----
```

```
# consider incentives for EVs and PHEVs
```

```
plot2_data <-
```

```
  increase_and_charger %>%
  left_join(state_w_incentive)
```

```
p3 <-
```

```
  plot2_data %>%
  filter(abb != 'DC') %>%
  ggplot() +
  geom_point(aes(x = charger_density,
                 y = percent,
                 color = EV_law_B),
             size = 4,
             alpha = 0.8) +
  scale_color_manual(values = c('#fc8d59', '#91cf60')) +
  geom_smooth(aes(x = charger_density,
                  y = percent,
                  fill = EV_law_B),
              method = 'lm',
              formula = y ~ x,
              se = F,
              color = '#969696') +
  theme_bw() +
  theme(axis.line = element_line(colour = '#969696'),
        axis.ticks = element_blank(),
        panel.grid.minor = element_blank(),
        panel.grid.major = element_line(linetype = 'dashed'),
        panel.border = element_blank())
```

```
# p4
```

```
p4 <-
```

```
  plot2_data %>%
  filter(abb != 'DC') %>%
  ggplot() +
  geom_point(aes(x = charger_density,
                 y = percent,
                 color = EV_law_B),
```

```

        size = 4,
        alpha = 0.8) +
scale_color_manual(values = c('#fc8d59', '#91cf60')) +
geom_smooth(aes(x = charger_density,
                y = percent,
                fill = EV_law_B),
            method = 'lm',
            formula = y ~ x,
            se = F,
            color = '#969696') +
theme_bw() +
theme(axis.line = element_line(colour = '#969696'),
      axis.ticks = element_blank(),
      panel.grid.minor = element_blank(),
      panel.grid.major = element_line(linetype = 'dashed'),
      panel.border = element_blank())

# Map -----

write_xlsx(plot2_data, 'DataStory/EV_map.xlsx')

```