EV Power - Lab 4 Project Report

David Lee

Example Solution 1

Part 0: libraries

```
library(tidyverse)
— Attaching core tidyverse packages
                                                                      - tidyverse 2.0.0
√ dplyr
            1.1.4 ✓ readr
                                       2.1.5

✓ forcats 1.0.1 ✓ stringr 1.5.2
✓ ggplot2 4.0.0 ✓ tibble 3.3.0
✓ lubridate 1.9.4 ✓ tidyr 1.3.1
✓ purrr 1.1.0
— Conflicts —
                                                              - tidyverse_conflicts()
* dplyr::filter() masks stats::filter()
                  masks stats::lag()
* dplyr::lag()
i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all
conflicts to become errors
library(stringr)
library(leaflet)
library(sf)
Linking to GEOS 3.13.1, GDAL 3.11.0, PROJ 9.6.0; sf_use_s2() is TRUE
library(maps)
Attaching package: 'maps'
The following object is masked from 'package:purrr':
    map
```

```
library(rnaturalearth)
```

Part 1: Defining Research Question

Chosen Question: Do states with higher shares of electricity that comes from clean sources have lower average electricity prices?

Part 2: Data Preparation and Cleaning

```
#Load datasets relevant to Renewable energy usage, energy prices, and total
energy usage
avg_energy_prices = read_csv("data/av-energy-price-2021-2023.csv")
```

```
Rows: 54 Columns: 1

— Column specification

Delimiter: ","
chr (1): Total energy average price, dollars per million Btu,,,

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
renewable_energy_usage_2021 = read_csv("data/renew-use-2021.csv")
```

```
Rows: 260 Columns: 3

— Column specification

Delimiter: ","
chr (3): State, Energy_Source, Renewable_Use_2021

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
renewable_energy_usage_2022 = read_csv("data/renew-use-2022.csv")
```

```
Rows: 260 Columns: 3

— Column specification

Delimiter: ","
chr (3): State, Energy_Source, Renewable_Use_2022

i Use `spec()` to retrieve the full column specification for this data.
```

i Specify the column types or set `show_col_types = FALSE` to quiet this message.

renewable energy usage 2023 = read csv("data/renew-use-2023.csv")

Rows: 260 Columns: 3

— Column specification

Delimiter: ","
chr (3): State, Energy_Source, Renewable_Use_2023

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.

total_energy_usage_2021 = read_csv("data/total-use-2021.csv")

Rows: 5 Columns: 53

— Column specification

Delimiter: ","
chr (1): Energy_Source
dbl (52): AK, AL, AR, AZ, CA, CO, CT, DC, DE, FL, GA, HI, IA, ID, IL, IN,
KS...

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.

total_energy_usage_2022 = read_csv("data/total-use-2022.csv")

Rows: 5 Columns: 53

— Column specification

Delimiter: ","
chr (1): Energy_Source
dbl (52): AK, AL, AR, AZ, CA, CO, CT, DC, DE, FL, GA, HI, IA, ID, IL, IN,
KS...

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.

```
total energy usage 2023 = read csv("data/total-use-2023.csv")
```

```
Rows: 5 Columns: 53

— Column specification

Delimiter: ","
chr (1): Energy_Source
dbl (52): AK, AL, AR, AZ, CA, CO, CT, DC, DE, FL, GA, HI, IA, ID, IL, IN,
KS...

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
#Standardize Columns.
total_energy_usage_2021 <- total_energy_usage_2021 |>
    rename()
#Renewable_Energy_Usage data is very messy. Standardized Units? ($, KWH, etc)
#Create a tidy dataframe with col:
#Cols: State, Coal, Natural Gas, Petroleum (BTU), nuclear,
total renewable energy
#Currently each state has a col, with rows for each energy source. I want to
flip this.
#Transform dataset
# state (abbrev)
#make a pivot longer for total energy usage for each year
#I want each column of 53 locations (50 states and 1 cumulative USA) to be a
separate data entry for each usage.
tidy 2021 energy usage <- total energy usage 2021 |>
    pivot_longer(cols = 2:length(total_energy_usage_2021), names_to = "state",
values_to = "values") |>
    pivot_wider(names_from = "Energy_Source", values_from = "values") |>
   mutate(year = 2021)
# ---- replicate for 2022 -----
tidy_2022_energy_usage <- total_energy_usage_2022 |>
    pivot_longer(cols = 2:length(total_energy_usage_2022), names_to = "state",
values_to = "values") |>
    pivot wider(names from = "Energy Source", values from = "values") |>
    mutate(year = 2022)
```

```
# ---- replicate for 2023 -----
tidy_2023_energy_usage <- total_energy_usage_2023 |>
    pivot_longer(cols = 2:length(total_energy_usage_2023), names_to = "state",
values to = "values") |>
    pivot wider(names from = "Energy Source", values from = "values") |>
    mutate(year = 2023)
# STANDARDIZE Column Names OR add another column with Year. Then merge all
data frames together to create panel data
STANDARDIZED COLUMN NAMES <- c("State", "Coal Consumption", "Natural Gas",
"Petroleum (BTU)", "Nuclear Energy", "Total Renewable Energy", "Year")
colnames(tidy_2023_energy_usage) = STANDARDIZED_COLUMN_NAMES
colnames(tidy 2022 energy usage) = STANDARDIZED COLUMN NAMES
colnames(tidy_2021_energy_usage) = STANDARDIZED_COLUMN_NAMES
### CLEAN avg energy prices -> turn each row of STATE(abbrev), AMOUNT
(unstructured),
#STATE, YEAR (2021-2023)
## ie., CA, 2021 amount per million BTU, 2022 amount per million BTU, 2023
amount per million BTU
#STATE ABBREVIATION: "^[A-Z]{2}"
# Amount per million BTU: /d*//./d*
#\d*\.\d*
tidy_avg_energy_prices <- avg_energy_prices |>
    separate wider delim(
    "Total energy average price, dollars per million Btu,,,",
    delim = ", ",
    names = c("State", "2021", "2022", "2023")
    #Filters empty/header row
    filter(!State %in% c("", "State", NA)) |>
    #extract numeric values
    mutate(
        across('2021':'2023', ~parse_number(.x))
    ) |>
    pivot longer(cols = c("2021", "2022", "2023"), names to = "Year",
values_to = "Avg_Energy_Price") |>
    mutate(Year = as.double(Year), Avg_Energy_Price =
Avg Energy Price/1000000)
#Price PER MILLION IS NOW PRICE PER BTU
```

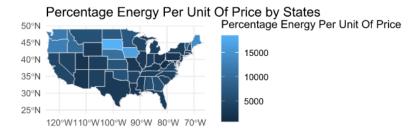
Part 3: Joining / Pivoting Datasets for Analysis

```
#combine yearly files into single tables as needed
```

```
#Document which method you chose and why. Create new variables such as % of
renewable ernergy out of total energy, ratio of EV registrations, etc
#combine 2021, 2022, 2023 data to have panel data.
joined energy usage <- bind rows(tidy 2021 energy usage,
tidy_2022_energy_usage, tidy_2023_energy_usage)
single_table <- left_join(joined_energy_usage, tidy_avg_energy_prices, by =
c("State", "Year")) |>
   # mutate(Total_Coal_Price = Avg_Energy_Price * `Coal Consumption`,
Total Natural Gas Price = Avg Energy Price * `Natural Gas`,
Total Petroleum Price = Avg Energy Price * `Petroleum (BTU)`,
Total_Nuclear_Energy_Price = Avg_Energy_Price * `Nuclear Energy`,
Total_Renewable_Energy_Price = Avg_Energy_Price * `Total Renewable Energy`) |>
#Total Price of Fuel for Components
    mutate(Total_Non_Renewable_Energy_Usage = `Coal Consumption`+ `Natural
Gas` + `Petroleum (BTU)` + `Nuclear Energy`) |> #Total Non Renewable Energy
Usage
    mutate(Total Energy Usage = Total Non Renewable Energy Usage + `Total
Renewable Energy`) |> #Total Energy Usage
    mutate(Proportion_of_Renewable_Energy = `Total Renewable Energy`/
Total_Energy_Usage, Percentage_Energy_Per_Unit_Of_Price =
Proportion_of_Renewable_Energy/Avg_Energy_Price) |>
    select(State, `Total Renewable Energy`, Year, Avg_Energy_Price,
Proportion_of_Renewable_Energy, Percentage_Energy_Per_Unit_Of_Price)
```

Part 4: Mapping Visualization

```
#df <- single table |>
# mutate(Year = as.integer(Year))
#us_states <- st_as_sf(map("state", plot = FALSE, fill = TRUE))</pre>
test_2021_table <- single_table |>
    filter(Year == 2021)
us states <- ne states(country = "united states of america", returnclass =</pre>
"sf")
us joined <- us states |>
    right join(test 2021 table, by = join by("postal"=="State"))
#Plot and Color by Proportion
ggplot(us_joined) +
    geom_sf(aes(fill=Percentage_Energy_Per_Unit_Of_Price), color = "white") +
  scale fill continuous(name = "Percentage Energy Per Unit Of Price", na.value
= "grey90") +
  labs(title = "Percentage Energy Per Unit Of Price by States") +
  coord sf(xlim = c(-125, -66), ylim = c(24, 50), expand = FALSE) +
  theme minimal()
```



Title: Higher Number

Overview:

Do states with higher shares of electricity that comes from clean sources have lower average electricity prices?

Data and Methods:

Show keys tables or data summaries (head() of joined dataset)

head(us_joined)

```
Simple feature collection with 6 features and 126 fields
Geometry type: MULTIPOLYGON
Dimension:
               XY
Bounding box:
              xmin: -124.7346 ymin: 41.69681 xmax: -82.4146 ymax: 49.36949
Geodetic CRS: WGS 84
                      featurecla scalerank adm1_code diss_me iso_3166_2
1 Admin-1 states provinces lakes
                                         2 USA-3519
                                                         3519
                                                                   US-WA
                                         2 USA-3518
                                                                   US-ID
2 Admin-1 states provinces lakes
                                                         3518
3 Admin-1 states provinces lakes
                                         2 USA-3515
                                                         3515
                                                                   US-MT
4 Admin-1 states provinces lakes
                                         2
                                            USA-3516
                                                         3516
                                                                   US-ND
5 Admin-1 states provinces lakes
                                         2 USA-3514
                                                                   US-MN
                                                         3514
6 Admin-1 states provinces lakes
                                         2 USA-3562
                                                         3562
                                                                   US-MI
                                        wikipedia iso a2 adm0 sr
                                                                          name
1 http://en.wikipedia.org/wiki/Washington_(state)
                                                       US
                                                                6
                                                                    Washington
2
                                                       US
                                                                1
               http://en.wikipedia.org/wiki/Idaho
                                                                         Idaho
3
             http://en.wikipedia.org/wiki/Montana
                                                       US
                                                                1
                                                                       Montana
4
        http://en.wikipedia.org/wiki/North_Dakota
                                                       US
                                                                1 North Dakota
5
           http://en.wikipedia.org/wiki/Minnesota
                                                       US
                                                                     Minnesota
            http://en.wikipedia.org/wiki/Michigan
                                                       US
                                                                1
                                                                      Michigan
  name alt name local type type en code local code hasc note hasc maybe
```

```
1 WA|Wash.
                  <NA> State
                                             US53
                                                      US.WA <NA>
                                                                         <NA>
                                State
2 ID|Idaho
                  <NA> State
                                State
                                             US16
                                                      US.ID <NA>
                                                                         <NA>
                  <NA> State
                                                                         <NA>
3 MT|Mont.
                                State
                                             US30
                                                      US.MT <NA>
4 ND|N.D.
                  <NA> State
                                             US38
                                                      US.ND <NA>
                                                                         <NA>
                                State
5 MN|Minn.
                  <NA> State
                                State
                                             US27
                                                      US.MN <NA>
                                                                         <NA>
6 MI|Mich.
                  <NA> State
                                State
                                             US26
                                                      US.MI <NA>
                                                                         <NA>
   region region_cod provnum_ne gadm_level check_me datarank abbrev postal
                 <NA>
                                                    20
1
     West
                                0
                                                               1
                                                                  Wash.
                                                                             WA
                                            1
2
     West
                 <NA>
                                0
                                            1
                                                    20
                                                               1
                                                                  Idaho
                                                                             ID
3
     West
                 <NA>
                                0
                                            1
                                                    20
                                                               1
                                                                  Mont.
                                                                             MT
4 Midwest
                                0
                                            1
                                                                   N.D.
                                                                             ND
                 <NA>
                                                    20
                                                               1
5 Midwest
                                0
                                            1
                                                                  Minn.
                 <NA>
                                                    20
                                                               1
                                                                             MN
                                0
6 Midwest
                 <NA>
                                            1
                                                    20
                                                               1
                                                                  Mich.
                                                                             ΜI
  area_sqkm sameascity labelrank name_len mapcolor9 mapcolor13 fips fips_alt
1
          0
                    -99
                                 0
                                          10
                                                     1
                                                                 1 US53
                                                                             <NA>
          0
2
                    -99
                                 0
                                           5
                                                     1
                                                                 1 US16
                                                                             <NA>
3
          0
                    -99
                                           7
                                                                 1 US30
                                                                             <NA>
                                 0
                                                     1
4
          0
                    -99
                                 0
                                          12
                                                     1
                                                                 1 US38
                                                                             <NA>
          0
5
                    -99
                                 0
                                           9
                                                     1
                                                                             <NA>
                                                                 1 US27
6
                    -99
                                           8
                                                     1
                                                                             <NA>
                                                                 1 US26
                                  woe label
                                                 woe name latitude longitude
   woe id
1 2347606
            Washington, US, United States
                                               Washington 47.4865 -120.3610
2 2347571
                  Idaho, US, United States
                                                    Idaho
                                                            43.7825 -114.1330
3 2347585
                Montana, US, United States
                                                            46.9965 -110.0440
                                                  Montana
4 2347593 North Dakota, US, United States North Dakota
                                                           47.4675 -100.3020
              Minnesota, US, United States
5 2347582
                                                Minnesota
                                                            46.0592
                                                                      -93.3640
6 2347581
              Michigan, US, United States
                                                            43.4343
                                                                      -84.9479
                                                 Michigan
  sov a3 adm0 a3 adm0 label
                                                  admin
                                                                          aeonunit
1
     US1
              USA
                            2 United States of America United States of America
2
     US1
              USA
                           2 United States of America United States of America
3
     US1
              USA
                           2 United States of America United States of America
4
                           2 United States of America United States of America
     US1
              USA
5
     US1
              USA
                           2 United States of America United States of America
6
     US1
              USA
                            2 United States of America United States of America
  gu_a3
          gn_id
                      gn_name gns_id gns_name gn_level gn_region gn_al_code
    USA 5815135
                   Washington
                                   - 1
                                           <NA>
                                                        1
                                                               <NA>
                                                                          US.ID
2
    USA 5596512
                        Idaho
                                           <NA>
                                                        1
                                                               <NA>
                                   - 1
3
    USA 5667009
                      Montana
                                   -1
                                           <NA>
                                                        1
                                                               <NA>
                                                                          US.MT
4
    USA 5690763 North Dakota
                                   -1
                                           <NA>
                                                        1
                                                               <NA>
                                                                          US.ND
5
                                                               <NA>
    USA 5037779
                    Minnesota
                                   - 1
                                           <NA>
                                                        1
                                                                          US.MN
6
    USA 5001836
                                   -1
                                           <NA>
                                                        1
                                                               <NA>
                                                                          US.MI
                     Michigan
          region_sub sub_code gns_level gns_lang gns_adm1 gns_region min_label
1
              Pacific
                           <NA>
                                        - 1
                                               <NA>
                                                         <NA>
                                                                     <NA>
                                                                                3.5
2
                                        -1
                           <NA>
                                               <NA>
                                                         <NA>
                                                                     <NA>
                                                                                3.5
            Mountain
3
            Mountain
                           <NA>
                                        -1
                                               <NA>
                                                         <NA>
                                                                     <NA>
                                                                                3.5
4 West North Central
                           <NA>
                                        -1
                                               <NA>
                                                         <NA>
                                                                     <NA>
                                                                                3.5
5 West North Central
                                        -1
                           <NA>
                                               <NA>
                                                         <NA>
                                                                     <NA>
                                                                                3.5
6 East North Central
                           <NA>
                                        -1
                                               <NA>
                                                         <NA>
                                                                     <NA>
                                                                                3.5
```

```
max label min zoom wikidataid
                                          name ar
                                                     name bn
                                                                   name de
                                                     ওয়াশিংটন
1
        7.5
                    2
                           Q1223
                                           واشنطن
                                                               Washington
2
                    2
                                                      আইডাহো
        7.5
                           Q1221
                                           أيداهو
                                                                      Idaho
3
        7.5
                    2
                           Q1212
                                          مونتا نا
                                                       মন্টানা
                                                                  Montana
4
                    2
                           Q1207 داكوتا الشمالية North Dakota
        7.5
5
        7.5
                    2
                           01527
                                                     মিনেসোটা
                                                                Minnesota
                                         مينيسوتا
                                                     মিশিগান
6
        7.5
                    2
                           Q1166
                                                                 Michigan
                                          ميشيغان
       name en
                         name es
                                         name fr
                                                         name el
                                                                       name hi
1
                                     Washington
                                                     Ουάσινγκτον वॉशिंगटन राज्य
    Washington
                      Washington
2
         Idaho
                           Idaho
                                           Idaho
                                                         Άινταχο
                                                                        आयडाहो
3
                                                                       मोन्टाना
       Montana
                         Montana
                                         Montana
                                                         Μοντάνα
 North Dakota Dakota del Norte Dakota du Nord Βόρεια Ντακότα
                                                                   उत्तर डेकोटा
     Minnesota
                                                                      मिनेसोटा
5
                       Minnesota
                                       Minnesota
                                                        Μινεσότα
6
      Michigan
                                                        Μίσιγκαν
                                                                       मिशिगन
                        Míchigan
                                        Michigan
       name_hu
                     name_id
                                      name_it
                                                      name ja
                                                                 name_ko
1
    Washington
                  Washington
                                  Washington
                                                 ワシントン州
                                                                워싱턴
2
         Idaho
                       Idaho
                                                   アイダホ州
                                                              아이다호
                                        Idaho
3
       Montana
                     Montana
                                                   モンタナ州
                                                                 몬태나
                                     Montana
4 Észak-Dakota Dakota Utara Dakota del Nord
                                              ノースダコタ州 노스다코타
5
     Minnesota
                  Minnesota
                                                              미네소타
                                    Minnesota
                                                   ミネソタ州
6
                                                   ミシガン州
                                                                 미시간
      Michigan
                   Michigan
                                    Michigan
       name_nl
                        name_pl
                                         name_pt
                                                          name_ru
                                                                        name_sv
1
    Washington
                     Waszyngton
                                     Washington
                                                        Вашингтон
                                                                    Washington
2
         Idaho
                          Idaho
                                           Idaho
                                                           Айдахо
                                                                          Idaho
3
       Montana
                        Montana
                                         Montana
                                                          Монтана
                                                                        Montana
4 Noord-Dakota Dakota Północna Dakota do Norte Северная Дакота North Dakota
5
     Minnesota
                      Minnesota
                                       Minnesota
                                                        Миннесота
                                                                     Minnesota
                                        Michigan
6
      Michigan
                       Michigan
                                                          Мичиган
                                                                       Michigan
       name tr
                   name vi
                              name zh
                                            ne id
                                                         name he
                                                                          name uk
1
     Vaşington Washington
                             华盛顿州 1159309547
                                                     וושינגטון
                                                                  Вашингтон
2
         Idaho
                     Idaho
                             爱达荷州 1159315339
                                                                       Айдахо
                                                        איידהו
3
       Montana
                   Montana
                             蒙大拿州 1159315333
                                                        מונטנה
                                                                      Монтана
4 Kuzey Dakota Bắć Dakota 北达科他州 1159315337 דקוטה הצפונית Північна Дакота
5
     Minnesota
                Minnesota 明尼苏达州 1159315297
                                                                   Міннесота
                                                       מינסוטה
6
      Michigan
                 Michigan
                             密歇根州 1159314665
                                                                      Мічиган
                                                        מישיגן
        name ur
                        name fa
                                  name zht FCLASS ISO FCLASS US FCLASS FR
ایالت واشینگتن 1
                 ریاست واشنگٹن
                                                 <NA>
                                                            <NA>
                                   華盛頓州
                                                                      <NA>
2
         آيداهو
                         ايداهو
                                                 <NA>
                                                            <NA>
                                                                      <NA>
                                   愛達荷州
3
                        مونٹا نا
         ايالت مونتانا
                                   蒙大拿州
                                                 <NA>
                                                            <NA>
                                                                      <NA>
4
                    北達科他州 北達科他州
                                                 <NA>
                                                           <NA>
                                                                      <NA>
    داكوتاي شمالي
5
                       明尼蘇達州 のまま
                                                 <NA>
                                                           <NA>
                                                                      <NA>
       مينهسوتا
6
                                                 <NA>
                                                            <NA>
                                                                      <NA>
         میشیگان
                         مشی گن
                                   密歇根州
  FCLASS RU FCLASS ES FCLASS CN
                                 FCLASS TW FCLASS IN FCLASS NP FCLASS PK
                            <NA>
1
       <NA>
                  <NA>
                                       <NA>
                                                 <NA>
                                                            <NA>
                                                                       <NA>
2
       <NA>
                  <NA>
                            <NA>
                                       <NA>
                                                 <NA>
                                                            <NA>
                                                                       <NA>
3
       <NA>
                  <NA>
                            <NA>
                                       <NA>
                                                 <NA>
                                                            <NA>
                                                                       <NA>
4
                                                                       <NA>
       <NA>
                 <NA>
                            <NA>
                                       <NA>
                                                 <NA>
                                                            <NA>
5
       <NA>
                  <NA>
                            <NA>
                                       <NA>
                                                 <NA>
                                                            <NA>
                                                                       <NA>
```

```
<NA>
                                        <NA>
                                                               <NA>
6
       <NA>
                             <NA>
                                                   <NA>
                                                                          <NA>
  FCLASS_DE FCLASS_GB FCLASS_BR FCLASS_IL FCLASS_PS FCLASS_SA FCLASS_EG
1
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                          <NA>
2
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                         <NA>
3
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                          <NA>
4
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                          <NA>
5
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                         <NA>
6
       <NA>
                  <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                          <NA>
                             <NA>
  FCLASS_MA FCLASS_PT FCLASS_AR FCLASS_JP FCLASS_KO FCLASS_VN FCLASS_TR
1
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                         <NA>
2
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                         <NA>
3
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                          <NA>
4
       <NA>
                  < NA >
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                          <NA>
5
       <NA>
                  <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                          <NA>
                             <NA>
6
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                          <NA>
  FCLASS ID FCLASS PL FCLASS GR FCLASS IT FCLASS NL FCLASS SE FCLASS BD
1
       <NA>
                                                               <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                                          <NA>
2
       <NA>
                  <NA>
                                                   <NA>
                                                                         <NA>
                             <NA>
                                        <NA>
                                                              <NA>
3
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                              <NA>
                                                                          <NA>
4
                  <NA>
       <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                          <NA>
5
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                         <NA>
6
       <NA>
                  <NA>
                             <NA>
                                        <NA>
                                                   <NA>
                                                               <NA>
                                                                          <NA>
  FCLASS UA FCLASS TLC Total Renewable Energy Year Avg Energy Price
1
       <NA>
                    <NA>
                                           394052 2021
                                                               2.095e-05
2
       <NA>
                   <NA>
                                            74428 2021
                                                               1.934e-05
3
       <NA>
                    <NA>
                                            56334 2021
                                                               2.062e-05
4
                   <NA>
       <NA>
                                            92653 2021
                                                                1.559e-05
5
       <NA>
                   <NA>
                                           216113 2021
                                                               1.875e-05
       <NA>
                    <NA>
                                           194075 2021
                                                                1.938e-05
  Proportion_of_Renewable_Energy Percentage_Energy_Per_Unit_Of_Price
1
                         0.2438154
                                                                 11637.966
2
                         0.1856439
                                                                  9598.963
3
                         0.1271964
                                                                  6168.592
4
                                                                  7298.296
                         0.1137804
5
                         0.1327478
                                                                  7079.882
6
                         0.0705000
                                                                  3637.771
                          geometry
1 MULTIPOLYGON (((-122.753 48...
2 MULTIPOLYGON (((-117.0382 4...
3 MULTIPOLYGON (((-116.0482 4...
4 MULTIPOLYGON (((-104.0476 4...
5 MULTIPOLYGON (((-97.22609 4...
6 MULTIPOLYGON (((-84.4913 46...
```

```
summarize(us_joined)
```

Simple feature collection with 1 feature and 0 fields

Geometry type: MULTIPOLYGON

Dimension: XY

Bounding box: xmin: -179.1435 ymin: 18.90612 xmax: 179.7809 ymax: 71.4125

Geodetic CRS: WGS 84

geometry

1 MULTIPOLYGON (((-90.92863 4...

summary(us_joined)

featurecla	scalerank adm1	_code dis	s_me
Length:52	Min. :2 Lengtl	n:52 Min.	:3513
Class :character	1st Qu.:2 Class	:character 1st Qu	1.:3526
Mode :character	Median :2 Mode	:character Mediar	:3538
	Mean :2	Mean	:3538
	3rd Qu.:2	3rd Qι	ı.:3550
	Max. :2	Max.	:3563
	NA's :1	NA's	:1
iso_3166_2	wikipedia	iso_a2	adm0 sr
Length:52	Length:52	Length:52	
Class :character	Class :character	Class :character	1st Qu.:1.000
Mode :character	Mode :character	Mode :character	Median :1.000
			Mean :2.627
			3rd Qu.:5.000
			Max. :8.000
			NA's :1
name	name_alt	name_local	type
Length:52	Length:52	Length:52	Length:52
Class :character	Class :character	Class :character	Class :character
Mode :character	Mode :character	Mode :character	Mode :character
riode renardeter	riode rendraceer	riode rendracter	riode Tenar de ter
type_en	code_local	code_hasc	note
Length:52	Length:52	Length:52	Length:52
Class :character	Class :character	Class :character	Class :character
Mode :character	Mode :character	Mode :character	Mode :character
riode icharacter	node icharacter	riode .ciiai actei	Hode Icharacter
hasc_maybe	region	region_cod	provnum_ne
Length: 52	Length:52	Length:52	Min. :0
Class :character	Class :character	Class :character	1st Ou.:0
Mode :character	Mode :character	Mode :character	Median :0
riode : Character	rioue : character	rioue : cilaracter	Heurall :0

```
:0
                                                            Mean
                                                            3rd Ou.:0
                                                            Max.
                                                                    : 0
                                                            NA's
                                                                    :1
  gadm_level
                 check_me
                               datarank
                                               abbrev
Min.
      :1
                     :20
                                   :1.000
                                            Length:52
             Min.
                           Min.
1st Qu.:1
             1st Qu.:20
                           1st Qu.:1.000
                                            Class :character
Median :1
             Median :20
                           Median :1.000
                                            Mode :character
                     :20
                                   :1.137
Mean
       :1
             Mean
                           Mean
3rd Qu.:1
             3rd Qu.:20
                           3rd Qu.:1.000
                     :20
                                   :8.000
Max.
       :1
             Max.
                           Max.
             NA's
                           NA's
                                   :1
NA's
       :1
                     :1
   postal
                      area sqkm
                                   sameascity
                                                     labelrank
                                        :-99.00
                                                          :0.0000
Length:52
                    Min.
                           :0
                                Min.
                                                   Min.
                    1st Qu.:0
                                1st Qu.:-99.00
Class : character
                                                   1st Qu.:0.0000
Mode :character
                    Median :0
                                Median :-99.00
                                                   Median :0.0000
                                        :-96.88
                                                          :0.1765
                    Mean
                           :0
                                Mean
                                                   Mean
                    3rd Ou.:0
                                3rd Qu.:-99.00
                                                   3rd Qu.:0.0000
                                        : 9.00
                                                          :9.0000
                    Max.
                           : 0
                                Max.
                                                   Max.
                    NA's
                                                   NA's
                           :1
                                 NA's
                                        :1
                                                          :1
                    mapcolor9
                                 mapcolor13
   name len
                                                 fips
       : 4.000
Min.
                  Min.
                         :1
                              Min.
                                      :1
                                            Length:52
1st Qu.: 7.000
                  1st Qu.:1
                               1st Qu.:1
                                            Class : character
Median : 8.000
                  Median :1
                              Median :1
                                            Mode :character
Mean
     : 8.667
                  Mean :1
                              Mean
                                     :1
3rd Qu.:10.000
                  3rd Qu.:1
                               3rd Qu.:1
       :20.000
Max.
                         :1
                              Max.
                                      :1
                  Max.
NA's
       :1
                  NA's
                         :1
                               NA's
                                      :1
  fips_alt
                        woe id
                                        woe label
                                                             woe name
Length:52
                    Min.
                           :2347559
                                       Length:52
                                                           Length:52
                    1st Qu.:2347572
Class :character
                                       Class :character
                                                           Class :character
Mode :character
                    Median :2347584
                                       Mode :character
                                                           Mode :character
                    Mean
                           :2347584
                    3rd Qu.:2347597
                    Max.
                           :2347609
                    NA's
                           :1
   latitude
                   longitude
                                       sov_a3
                                                          adm0_a3
Min.
       :21.49
                        :-158.00
                                    Length:52
                                                        Length:52
                 Min.
1st Qu.:35.68
                 1st Qu.:-102.92
                                    Class : character
                                                        Class : character
                 Median : -89.58
                                                        Mode :character
Median :39.50
                                    Mode :character
                        : -93.38
       :39.59
Mean
                 Mean
                 3rd Qu.: -78.55
3rd Qu.:43.32
Max.
       :65.36
                 Max.
                        : -69.20
NA's
       :1
                 NA's
                        :1
  adm0_label
                 admin
                                    geonunit
                                                         gu_a3
Min.
       :2
             Length:52
                                  Length:52
                                                      Length:52
1st Qu.:2
             Class :character
                                                      Class :character
                                  Class :character
Median :2
             Mode :character
                                  Mode :character
                                                      Mode :character
```

```
Mean
       :2
3rd Ou.:2
Max.
       :2
NA's
       :1
    gn_id
                                          gns_id
                                                     gns_name
                    gn_name
       :4099753
                  Length:52
                                     Min. :-1
                                                   Length:52
Min.
1st Qu.:4629604
                                      1st Qu.:-1
                  Class :character
                                                   Class : character
                                                   Mode :character
Median :5090174
                                     Median :-1
                  Mode :character
Mean
       :5113064
                                      Mean
3rd Qu.:5574132
                                      3rd Qu.:-1
       :6254928
                                             :-1
Max.
                                     Max.
                                      NA's
NA's
      :1
                                             :1
   gn level gn region
                                gn al code
                                                    region sub
            Length:52
                                                   Length:52
Min.
     :1
                                Length:52
1st Ou.:1
            Class :character
                               Class : character
                                                   Class : character
Median :1
            Mode :character
                               Mode :character
                                                   Mode :character
Mean
       :1
3rd Qu.:1
Max.
       :1
NA's
       :1
                     gns_level
                                                      gns adm1
  sub code
                                   gns_lang
Length:52
                   Min. :-1
                                Length:52
                                                    Length:52
Class :character
                   1st Qu.:-1
                                 Class :character
                                                    Class :character
Mode :character
                   Median :-1
                                Mode :character
                                                    Mode :character
                   Mean :-1
                   3rd Qu.:-1
                   Max.
                          :-1
                   NA's
                          :1
 gns_region
                     min label
                                   max label
                                                   min zoom wikidataid
Length:52
                   Min.
                          :3.5
                                  Min. :7.5
                                                Min. :2
                                                            Length:52
                   1st Qu.:3.5
                                  1st Qu.:7.5
                                                1st Qu.:2
Class :character
                                                            Class :character
                   Median :3.5
                                  Median :7.5
Mode :character
                                                Median :2
                                                            Mode :character
                          :3.5
                                                Mean
                   Mean
                                  Mean
                                       :7.5
                                                      :2
                   3rd Qu.:3.5
                                  3rd Qu.:7.5
                                                3rd Qu.:2
                   Max.
                          :3.5
                                  Max.
                                         :7.5
                                                Max.
                                                       :2
                   NA's
                          :1
                                  NA's
                                         :1
                                                NA's
                                                       :1
  name_ar
                     name_bn
                                         name_de
                                                            name_en
Length:52
                   Length:52
                                       Length:52
                                                          Length:52
Class : character
                   Class : character
                                       Class :character
                                                          Class : character
Mode :character
                   Mode :character
                                      Mode :character
                                                          Mode :character
  name_es
                     name_fr
                                         name_el
                                                            name_hi
Length:52
                   Length:52
                                       Length:52
                                                          Length:52
Class :character
                   Class :character
                                       Class :character
                                                          Class :character
Mode :character
                   Mode :character
                                      Mode :character
                                                          Mode :character
```

name_hu	name_id	name_it	name_ja
Length:52	Length:52	Length:52	Length:52
Class :character	Class :character	Class :character	Class :character
Mode :character	Mode :character	Mode :character	Mode :character
name_ko	name_nl	name_pl	name_pt
Length:52	Length:52	Length:52	Length:52
Class :character	Class :character	Class :character	Class :character
Mode :character	Mode :character	Mode :character	Mode :character
name_ru	name_sv	name_tr	name_vi
Length:52	Length:52	Length:52	Length:52
Class :character	Class :character	Class :character	Class :character
Mode :character	Mode :character	Mode :character	Mode :character
name_zh	ne_id Min. :1.159e+09 1st Qu.:1.159e+09 Median :1.159e+09 Mean :1.159e+09 3rd Qu.:1.159e+09 Max. :1.159e+09	name_he	name_uk
Length:52		Length:52	Length:52
Class :character		Class :character	Class :character
Mode :character		Mode :character	Mode :character
name_ur Length:52 Class :character Mode :character	NA's :1 name_fa Length:52 Class :character Mode :character	name_zht Length:52 Class :character Mode :character	FCLASS_ISO Length:52 Class :character Mode :character
FCLASS_US	FCLASS_FR	FCLASS_RU	FCLASS_ES
Length:52	Length:52	Length:52	Length:52
Class :character	Class :character	Class :character	Class :character
Mode :character	Mode :character	Mode :character	Mode :character

FCLASS_CN Length:52 Class :character Mode :character	FCLASS_TW Length:52 Class :character Mode :character	FCLASS_IN Length:52 Class :character Mode :character	
FCLASS_PK Length:52 Class :character Mode :character	FCLASS_DE Length:52 Class :character Mode :character		
FCLASS_IL Length:52 Class :character Mode :character			
FCLASS_MA Length:52 Class :character Mode :character	FCLASS_PT Length:52 Class :character Mode :character	Length:52	_
FCLASS_K0 Length:52 Class :character Mode :character	FCLASS_VN Length:52 Class :character Mode :character	FCLASS_TR Length:52 Class :character Mode :character	FCLASS_ID Length:52 Class :character Mode :character
FCLASS_PL Length:52 Class :character Mode :character	FCLASS_GR Length:52 Class :character Mode :character	FCLASS_IT Length:52 Class :character Mode :character	FCLASS_NL Length:52 Class :character Mode :character

```
FCLASS SE
                      FCLASS BD
                                             FCLASS UA
                                                                     FCLASS TLC
                                              Length:52
Length:52
                       Length:52
                                                                     Length:52
Class :character Class :character Class :character Class :character
Mode :character Mode :character Mode :character Mode :character
                                 Year Avg_Energy_Price
Total Renewable Energy
Min. : 2487 Min. :2021 Min. :1.248e-05

      1st Qu.: 60741
      1st Qu.:2021
      1st Qu.:1.883e-05

      Median : 115669
      Median :2021
      Median :1.987e-05

      Mean : 293889
      Mean :2021
      Mean :2.069e-05

      3rd Qu.: 194800
      3rd Qu.:2021
      3rd Qu.:2.180e-05

Max. :7646167
                          Max. :2021 Max. :3.269e-05
Proportion_of_Renewable_Energy Percentage_Energy_Per_Unit_Of_Price
        :0.01401
                                     Min. : 699.5
Min.
                                     1st Qu.: 2448.3
1st Qu.:0.05343
Median :0.07883
                                     Median : 3715.1
Mean :0.09995
                                     Mean : 4963.2
3rd Qu.:0.11370
                                     3rd Qu.: 5854.3
Max. :0.34874
                                     Max. :18500.8
           geometry
MULTIPOLYGON :52
epsg:4326 : 0
+proj=long...: 0
```

Analysis:

So a higher number means the state gets more renewable energy for every dollar spent.

What patterns do you notice?

How does your map help answer the main research question? - it gives a new metric - "How much renewable energy (%) you get per dollar spent on energy." - Proportion of Renewable Energy Divided by Average Energy Price -