# **Creating informative maps**

Based on Section 3.2.3 from Modern Data Science with R.

You can download this .qmd file from here. Just hit the Download Raw File button.

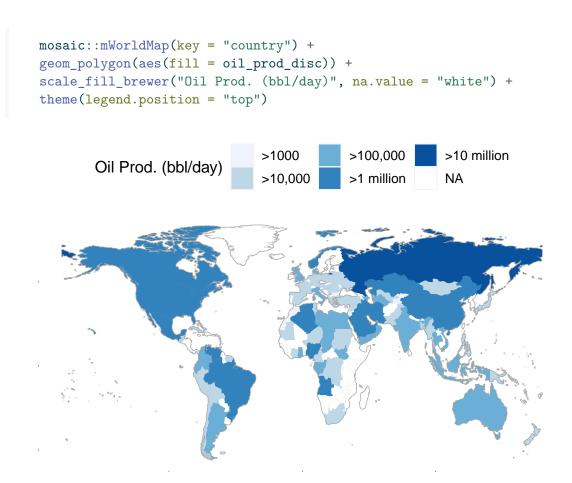
```
# Initial packages required (we'll be adding more)
library(tidyverse)
library(mdsr)  # package associated with our MDSR book
```

#### Opening example

Here is a simple choropleth map example from MDSR

```
# CIACountries is a 236 x 8 data set with information on each country
# taken from the CIA factbook - gdp, education, internet use, etc.
head(CIACountries)
```

```
country
                     pop
                            area oil_prod
                                            gdp educ
                                                      roadways net_users
                                        0 1900 NA 0.06462444
1
    Afghanistan 32564342
                          652230
                                                                     >5%
2
        Albania 3029278
                           28748
                                    20510 11900 3.3 0.62613051
                                                                    >35%
3
        Algeria 39542166 2381741 1420000 14500 4.3 0.04771929
                                                                    >15%
4 American Samoa
                   54343
                             199
                                        0 13000 NA 1.21105528
                                                                    <NA>
                                       NA 37200 NA 0.68376068
                                                                    >60%
        Andorra
                   85580
                             468
6
         Angola 19625353 1246700 1742000 7300 3.5 0.04125211
                                                                    >15%
```



## **Choropleth Maps**

When you have specific regions (e.g. countries, states, counties, census tracts,...) and a value associated with each region.

A choropleth map will color the entire region according to the value. For example, let's consider state vaccination data from March 2021.

```
vaccine_data <- read_csv("Data/vacc_Mar21.csv")

vacc_mar13 <- vaccine_data |>
  filter(Date =="2021-03-13") |>
  select(State, Date, people_vaccinated_per100, share_doses_used, Governor)

vacc_mar13
```

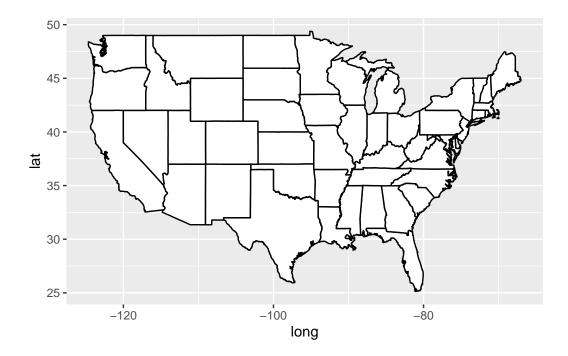
```
# A tibble: 50 x 5
  State Date
                         people_vaccinated_per100 share_doses_used Governor
  <chr>
              <date>
                                            <dbl>
                                                            <dbl> <chr>
1 Alabama
              2021-03-13
                                             17.2
                                                            0.671 R
2 Alaska
              2021-03-13
                                             27.0
                                                            0.686 R
3 Arizona
              2021-03-13
                                             21.5
                                                            0.821 R
4 Arkansas 2021-03-13
                                             19.2
                                                            0.705 R
5 California 2021-03-13
                                             20.3
                                                            0.726 D
6 Colorado 2021-03-13
                                             20.8
                                                            0.801 D
7 Connecticut 2021-03-13
                                             26.2
                                                            0.851 D
8 Delaware 2021-03-13
                                             20.2
                                                            0.753 D
9 Florida
              2021-03-13
                                             20.1
                                                            0.766 R
                                             15.2
10 Georgia
              2021-03-13
                                                            0.674 R
# i 40 more rows
```

The tricky part of choropleth maps is getting the shapes (polygons) that make up the regions. This is really a pretty complex set of lines for R to draw!

Luckily, some maps are already created in R in the maps package.

```
library(maps)
us_states <- map_data("state")
head(us_states)</pre>
```

```
lat group order region subregion
      long
1 -87.46201 30.38968
                              1 alabama
                                             <NA>
2 -87.48493 30.37249
                        1
                              2 alabama
                                             <NA>
3 -87.52503 30.37249
                        1
                              3 alabama
                                             <NA>
4 -87.53076 30.33239
                        1
                            4 alabama
                                             <NA>
5 -87.57087 30.32665
                              5 alabama
                       1
                                             <NA>
6 -87.58806 30.32665
                        1
                              6 alabama
                                             <NA>
```



Other maps provided by the maps package include US counties, France, Italy, New Zealand, and two different views of the world. If you want maps of other countries or regions, you can often find them online.

Sometimes maps may be provided as shapefiles. To use these, you'll first need to read them into R and then turn them into tidy dataframes in order to use them with ggplot. See here:. More on shapefiles in Part 2.

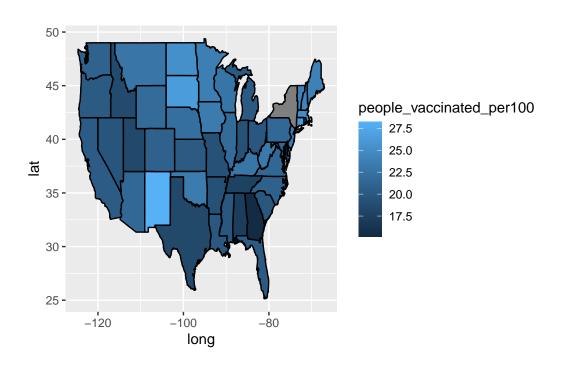
Where the really cool stuff happens is when we join our data to the us\_states dataframe. Notice that the state name appears in the "region" column of us\_states, and that the state name is in all small letters. In vacc\_mar13, the state name appears in the State column and is in title case. Thus, we have to be very careful when we join the state vaccine info to the state geography data.

Run this line by line to see what it does:

```
vacc_mar13 <- vacc_mar13 |>
  mutate(State = str_to_lower(State))

vacc_mar13 |>
  right_join(us_states, by = c("State" = "region")) |>
  rename(region = State) |>
  ggplot(mapping = aes(x = long, y = lat,
```

```
group = group)) +
geom_polygon(aes(fill = people_vaccinated_per100), color = "black")
```



oops, New York appears to be a problem.

```
vacc_mar13 |>
  anti_join(us_states, by = c("State" = "region"))
```

```
# A tibble: 3 x 5
```

	State	Date	<pre>people_vaccinated_per100</pre>	${\tt share\_doses\_used}$	${\tt Governor}$
	<chr></chr>	<date></date>	<dbl></dbl>	<dbl></dbl>	<chr></chr>
1	alaska	2021-03-13	27.0	0.686	R
2	hawaii	2021-03-13	22.8	0.759	D
3	new york state	2021-03-13	21.7	0.764	D

```
us_states |>
anti_join(vacc_mar13, by = c("region" = "State")) |>
count(region)
```

region n

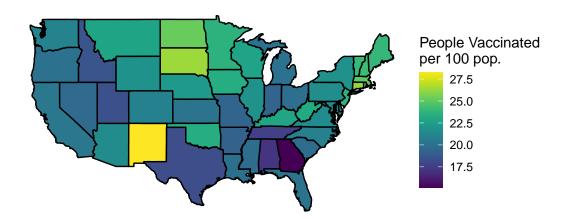
```
1 district of columbia 10
2 new york 495
```

[Pause to ponder:] What did we learn by running anti\_join() above?

Notice that the us\_states map also includes only the contiguous 48 states. This gives an example of creating really beautiful map insets for Alaska and Hawaii.

```
vacc_mar13 <- vacc_mar13 |>
    mutate(State = str_replace(State, " state", ""))
  vacc_mar13 |>
    anti_join(us_states, by = c("State" = "region"))
# A tibble: 2 x 5
                    people_vaccinated_per100 share_doses_used Governor
 State Date
  <chr> <date>
                                       <dbl>
                                                        <dbl> <chr>
1 alaska 2021-03-13
                                        27.0
                                                        0.686 R
2 hawaii 2021-03-13
                                        22.8
                                                        0.759 D
  us_states |>
    anti_join(vacc_mar13, by = c("region" = "State")) %>%
    count(region)
                region n
1 district of columbia 10
Better.
  library(viridis) # for color schemes
  vacc_mar13 |>
    right_join(us_states, by = c("State" = "region")) |>
    rename(region = State) |>
    ggplot(mapping = aes(x = long, y = lat,
                            group = group)) +
    geom_polygon(aes(fill = people_vaccinated_per100), color = "black") +
    labs(fill = "People Vaccinated\nper 100 pop.") +
    # This scales the longitude and latitude so that the shapes look correct.
    coord_map() +
    # This theme can give you a really clean look!
```

```
theme_void() +
# you can change the fill scale for different color schemes.
scale_fill_viridis()
```



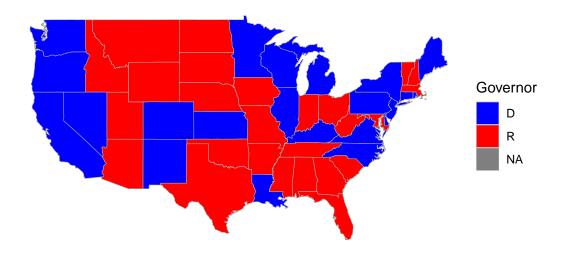
[Pause to ponder:] Use autofill to play with different themes and scale\_fills.

Note: Map projections are actually pretty complicated, especially if you're looking at large areas (e.g. world maps). It's impossible to preserve both shape and area when projecting a sphere onto a flat surface, so that's why you sometimes see such different maps of the world

There are a few different options in coord\_map(). See the help menu, although this function is being phased out.

You can also use a categorical variable to color regions:

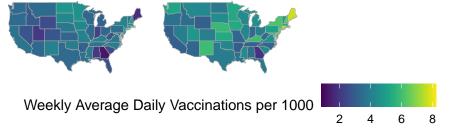
```
# This scales the longitude and latitude so that the shapes look correct.
coord_map() +
# This theme can give you a really clean look!
theme_void() +
# you can change the fill scale for different color schemes.
scale_fill_manual(values = c("blue", "red"))
```



## Multiple maps!

[Pause to ponder:] are we bothered by the warning about many-to-many when you run the code below?

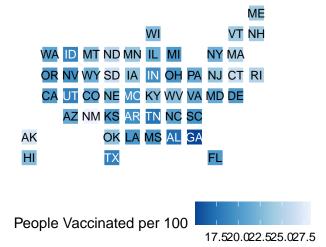
```
rename(region = State)
weekly_vacc |>
  filter(week > 2, week < 11) |>
  ggplot(mapping = aes(x = long, y = lat,
                           group = group)) +
  geom_polygon(aes(fill = mean_daily_vacc), color = "darkgrey", size = 0.1) +
  labs(fill = "Weekly Average Daily Vaccinations per 1000") +
  coord_map() +
  theme_void() +
  scale_fill_viridis() +
  facet_wrap(~date) +
  theme(legend.position = "bottom")
            2021-01-15
                                 2021-01-22
                                                      2021-01-29
            2021-02-05
                                 2021-02-12
                                                      2021-02-19
            2021-02-26
                                 2021-03-05
```



## Other cool state maps

## statebin (square representation of states)

```
library(statebins) # may need to install
vacc_mar13 |>
```



[Pause to ponder:] Why might one use a map like above instead of our previous choropleth maps?

I used this example to create the code above. The original graph is located here.

#### Interactive map with leaflet

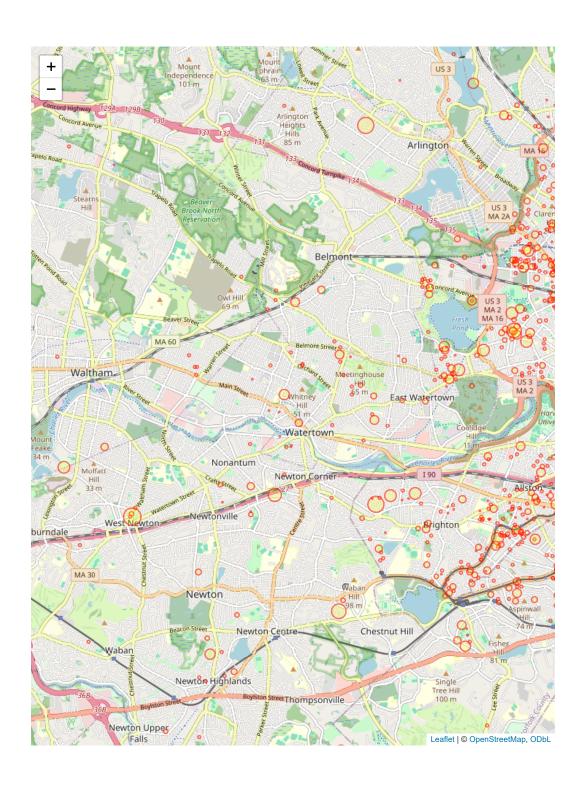
Leaflet is a powerful open-source JavaScript library for building interactive maps in HTML. Although the commands are different, the architecture is very similar to ggplot2. However, instead of putting data-based layers on top of a static map, leaflet allows you to put data-based layers on top of an interactive map. Because leaflet renders as HTML to allow interactivity, they are less effective as static pdfs.

With leaflet, you can have "pop-up" messages when you hover over points, and have a zoom-in and zoom-out option.

Two main features: addTiles() = Add background map setView() = Set where the map should originally zoom to

```
# This part is for the pop-up messages.... some are weird or just "\n" for example, so thi
  Encoding( x = airbnb.df$AboutListing ) <- "UTF-8"</pre>
  airbnb.df$AboutListing <-
    iconv( x = airbnb.df$AboutListing
           , from = "UTF-8"
           , to = "UTF-8"
           , sub = "" )
  head(airbnb.df)
# A tibble: 6 x 65
 ListingID Title
                    UserID baseurl Price AboutListing HostName MemberDate
     <dbl> <chr>
                     <dbl> <chr> <dbl> <chr>
                                                      <chr>
                                                                <chr>
                                                                           <dbl>
    281552 Harvard~ 1.47e6 https:~ 175 "\n"
                                                      Mary Ca~ December ~
                                                                           42.4
1
    182613 Luxury ~ 8.76e5 https:~ 249 "Entire lar~ Max
                                                               July 2011
                                                                            42.4
3
   1587540 Cozy Ho~ 2.00e6 https:~
                                    225 "\n"
                                                      Finola
                                                               March 2012 42.4
    469506 Luxury ~ 1.77e6 https:~
                                    140 "\n"
                                                      Rupal
                                                               February ~ 42.3
4
   3937268 Boston ~ 2.53e6 https:~
                                    99 "I offer a ~ Natasha June 2012
                                                                            42.3
   3036349 Top flo~ 1.37e6 https:~
                                     89 "Two bedroo~ Carol
                                                               November ~ 42.3
6
# i 56 more variables: Long <dbl>, BookInstantly <chr>, Cancellation <chr>,
   PageCounter <dbl>, PageNumber <dbl>, A_AC <dbl>, A_Breakfast <dbl>,
   A_CableTV <dbl>, A_CarbonMonoxDetector <dbl>, A_Doorman <dbl>,
   A_Dryer <dbl>, A_TV <dbl>, A_Elevator <dbl>, A_Essentials <dbl>,
   A_Events <dbl>, A_FamilyFriendly <dbl>, A_FireExt <dbl>, A_Fireplace <dbl>,
   A_FirstAidKit <dbl>, A_Gym <dbl>, A_Heat <dbl>, A_HotTub <dbl>,
   A_Intercom <dbl>, A_Internet <dbl>, A_Kitchen <dbl>, A_Parking <dbl>, ...
  # This part makes the map!
  leaflet() |>
      addTiles() |>
      setView(lng = mean(airbnb.df$Long), lat = mean(airbnb.df$Lat),
              zoom = 13) >
      addCircleMarkers(data = airbnb.df,
          lat = ~ Lat,
          lng = \sim Long,
          popup = ~ AboutListing,
          radius = ~ S_Accomodates,
          # These last options describe how the circles look
          weight = 2,
```

```
color = "red",
fillColor = "yellow")
```



#### On Your Own

The states dataset in the poliscidata package contains 135 variables on each of the 50 US states. See here for more detail.

Your task is to create a two meaningful choropleth plots, one using a numeric variable and one using a categorical variable from states. Write a sentence or two describing what you can learn from each plot.

Here's some R code to get you going:

```
library(poliscidata)
                          # may have to install first
  # Be sure you know what the mutate statement below is doing!
  state_data <- as_tibble(poliscidata::states) |>
    mutate(state name = str squish(str_to_lower(as.character(state)))) |>
    select(-state)
  print(state_data, n = 5, width = Inf)
# A tibble: 50 x 135
  abort_rank3 abortion_rank12 adv_or_more ba_or_more cig_tax12 cig_tax12_3
  <fct>
                         <dbl>
                                      <dbl>
                                                  <dbl>
                                                            <dbl> <fct>
                                                                  HiTax
1 Less restr
                            35
                                        9
                                                  26.6
                                                            2
2 Mid
                            20
                                        7.7
                                                  22
                                                            0.425 LoTax
3 More restr
                             4
                                        6.1
                                                  18.9
                                                            1.15 MidTax
4 More restr
                             5
                                        9.3
                                                  25.6
                                                                  HiTax
5 Less restr
                            49
                                       10.7
                                                  29.9
                                                            0.87 MidTax
  conserv_advantage conserv_public dem_advantage govt_worker gun_rank3
              <dbl>
                              <dbl>
                                             <dbl>
                                                          <dbl> <fct>
1
               21.3
                               43.1
                                             -12.2
                                                           28
                                                                Less restr
2
                               44.7
                                             -14.6
                                                           17.5 Mid
               36
3
               26.7
                               45.2
                                              -1.4
                                                           17.6 Less restr
4
               19.5
                               36
                                              -3.5
                                                           15.5 Less restr
5
                6.3
                               30.8
                                              14.9
                                                           14.9 More restr
  gun_rank11 gun_scale11 hr_cons_rank11 hr_conserv11 hr_lib_rank11 hr_liberal11
                    <dbl>
       <dbl>
                                    <dbl>
                                                  <dbl>
                                                                <dbl>
                                                                              <dbl>
1
          50
                        0
                                     200
                                                  55.7
                                                                 228
                                                                               44.3
2
          17
                       14
                                     152.
                                                  65.6
                                                                 278.
                                                                               34.4
3
          39
                        4
                                     132.
                                                  69.3
                                                                 295.
                                                                               30.7
4
                        0
                                                                               37.4
          50
                                     156.
                                                  62.6
                                                                 270.
           1
                       81
                                     274.
                                                  54.8
                                                                 152.
                                                                               81.0
  hs_or_more obama2012 obama_win12 pop2000
                                               pop2010 pop2010_hun_thou
       <dbl>
                  <dbl> <fct>
                                        <dbl>
                                                  <dbl>
                                                                    <dbl>
```

```
40.8 No
1
        91.4
                                       626932
                                                710231
                                                                     7.10
2
        82.1
                   38.4 No
                                      4447100 4779736
                                                                    47.8
3
                   36.9 No
        82.4
                                      2673400
                                               2915918
                                                                    29.2
4
        84.2
                   44.4 No
                                      5130632 6392017
                                                                    63.9
5
        80.6
                   60.2 Yes
                                     33871648 37253956
                                                                   373.
  popchng0010 popchngpct pot_policy
                                               prochoice prolife relig_cath
        <dbl>
                    <dbl> <fct>
                                                    <dbl>
                                                            <dbl>
1
        83299
                     13.3 Medicinal
                                                       58
                                                               37
                                                                         14.6
2
       332636
                      7.5 Decrim
                                                       36
                                                               54
                                                                          6.6
                      9.1 Not legal
                                                       40
                                                               55
                                                                          5.9
3
       242518
4
                     24.6 Medicinal
                                                       56
                                                               39
                                                                         27.3
      1261385
      3382308
                     10
                          Medicinal / Decrim.
                                                       65
                                                               28
                                                                         31.9
5
  relig_prot relig_high relig_low religiosity3 romney2012 smokers12 stateid
                   <dbl>
                             <dbl> <fct>
                                                       <dbl>
                                                                  <dbl> <fct>
       <dbl>
        50
                    31.3
                              39.5 Low
                                                        54.8
                                                                     24 "AK
1
2
        79.3
                    55.7
                              14.3 High
                                                        60.6
                                                                     25 "AL
3
        78.6
                    52.3
                              18.7 High
                                                        60.6
                                                                     26 "AR
4
        43.3
                    36.6
                              33.9 Mid
                                                        53.5
                                                                     21 "AZ
5
        37.8
                    34.5
                              36.6 Low
                                                        37.1
                                                                     15 "CA
  to_0812 uninsured_pct abort_rate05 abort_rate08 abortlaw3 abortlaw10 alcohol
                   <dbl>
                                                                      <dbl>
                                                                              <dbl>
    <dbl>
                                 <dbl>
                                              <dbl> <fct>
    -9.40
                    21.8
                                  13.6
                                               12
                                                     0-5 restr
                                                                          5
                                                                               3.02
1
    -2.90
                                                                               2.01
2
                    18.8
                                  11.9
                                               12
                                                     6-8 restr
                                                                          8
    -2.90
                    21.9
                                   8.3
                                                8.7 9-10 restr
                                                                          9
                                                                               1.83
3
4
    -3.10
                    20.5
                                  16
                                               15.2 6-8 restr
                                                                          6
                                                                               2.31
    -6.5
                    23.2
                                  27.1
                                               27.6 0-5 restr
                                                                               2.33
  attend_pct battle04 blkleg blkpct04 blkpct08 blkpct10 bush00 bush04 carfatal
       <dbl> <fct>
                                           <dbl>
                                                     <dbl>
                                                            <dbl>
                        <dbl>
                                  <dbl>
                                                                    <dbl>
                                                                             <dbl>
          22 No
                            2
                                                       4.7
1
                                    3.6
                                             4.3
                                                             58.6
                                                                     61.1
                                                                              17.4
2
          52 No
                           25
                                   26.4
                                            26.4
                                                      26.8
                                                             56.5
                                                                     62.5
                                                                              24.9
3
          50 No
                           11
                                   15.8
                                            15.8
                                                      16.1
                                                             51.3
                                                                     54.3
                                                                              25.6
          29 No
4
                            1
                                    3.5
                                             4.2
                                                       5
                                                             51.0
                                                                     54.8
                                                                              20.3
          33 No
                                             6.7
                                                       7.2
                                                             41.7
                                                                     44.4
5
                            5
                                    6.8
                                                                              12.1
  carfatal07 cig_tax cig_tax_3
                                  cigarettes college conpct_m cons_hr06 cons_hr09
       <dbl>
                <dbl> <fct>
                                        <dbl>
                                                <dbl>
                                                          <dbl>
                                                                     <dbl>
                                                                                <dbl>
                                         6.22
        15.2
                                                                                75
1
                      $1.41-$2.58
                                                  26.7
                                                           36.3
                                                                      72
2
        25.9
               0.425 $.07-$.64
                                         9.41
                                                  21.1
                                                           40.7
                                                                      77.7
                                                                                72
3
        23.7
               0.59 $.07-$.64
                                         8.51
                                                  19.1
                                                           38.9
                                                                      56.2
                                                                                28.5
4
        17.6
                      $1.41-$2.58
                                         2.4
                                                  24.3
                                                           33.3
                                                                      69
                                                                                49.5
               2
               0.87 $.695-$1.36
                                         3.69
                                                  29.1
                                                           28.5
                                                                      37.3
        11.7
                                                                                35.1
  cook_index cook_index3 defexpen demhr11 dem_hr09 demnat06 dempct_m demstate06
       <dbl> <fct>
                             <dbl>
                                                <dbl>
                                                                   <dbl>
                                      <dbl>
                                                         <dbl>
                                                                              <dbl>
1
       -13.4 More Rep
                              3556
                                        0
                                                  0
                                                           0
                                                                    26.1
                                                                               43.3
```

```
22.2
                                                                    38.9
                                                                               60.7
2
       -13.2 More Rep
                              1757
                                       14.3
                                                 42.9
3
        -8.8 More Rep
                               530
                                       25
                                                 75
                                                          83.3
                                                                    43.1
                                                                               75.6
        -6.1 Even
4
                              1771
                                       28.6
                                                 62.5
                                                          20
                                                                    31.9
                                                                               44.4
         7.4 More Dem
                              1106
                                       64.2
                                                 64.2
                                                          63.6
                                                                    41.3
                                                                               60.8
  demstate09 demstate13 density division
                                                 earmarks pcap
                                                                  evm
                                                                        evo evo2012
       <dbl>
                   <dbl>
                           <dbl> <fct>
                                                         <dbl> <dbl> <dbl>
                                                                              <dbl>
1
        46.7
                    36.7
                             1.2 Pacific
                                                         426.
                                                                    3
                            94.4 E. South Cent
2
        57.9
                    35.7
                                                          38.9
                                                                    9
                                                                          0
                                                                                   0
3
        72.6
                    46.7
                                 W. South Cent
                                                          26.7
                                                                          0
                                                                                   0
                                                                    6
        41.1
                    41.1
                            56.3 Mountain
                                                          20.9
                                                                                  0
4
                                                                   10
                                                                          0
5
        64.2
                    66.7
                           239. Pacific
                                                          12.5
                                                                    0
                                                                         55
                                                                                  55
  evr2012 gay_policy
                             gay_policy2 gay_policy_con gay_support gay_support3
    <dbl> <fct>
                             <fct>
                                                                  <dbl> <fct>
                                           <fct>
                             Conservative No
        3 Conservative
                                                                     56 Med
1
2
        9 Most conservative Conservative Yes
                                                                     44 Low
3
        6 Most conservative Conservative Yes
                                                                     44 Low
4
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3 Bush win Bush win
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                        45.9
                                 8443.
                                                             3.2
                                                                            13
4 Bush win Bush win
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                                  5314.
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5 Gore win Kerry win
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2
           19 Mid
3
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                                                                                  6.4
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              36.8
                                  60.3
                                           42.5
                                                    1.10
                                                            38.7 McCain win
                                                                                 13.2
2
      30.0
                        16.8
3
      35.9
              44.6
                        16.8
                                  58.7
                                           44.3
                                                    1.46
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      29.7
              44.4
                        19.2
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                        24.2
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