

EV Power - Lab 4 Project Report

Example Solution 1

Part 0: libraries

```
library(tidyverse)
```

```
Warning: package 'ggplot2' was built under R version 4.3.3
```

```
— Attaching core tidyverse packages — tidyverse 2.0.0
—
✓ dplyr      1.1.4      ✓ readr      2.1.5
✓ forcats    1.0.0      ✓ stringr    1.5.1
✓ ggplot2    3.5.2      ✓ tibble     3.2.1
✓ lubridate  1.9.3      ✓ tidyr      1.3.0
✓ purrr      1.0.2
— Conflicts — tidyverse_conflicts()
—
* dplyr::filter() masks stats::filter()
* dplyr::lag()     masks stats::lag()
i Use the conflicted package (<http://conflicted.r-lib.org/>) to force all
conflicts to become errors
```

```
library(stringr)
```

Part 1: Defining Research Question

Chosen Question: What is the geographic distribution of the share of renewable energy in the United States? Is there a correlation between the share of renewable energy used and the price of renewable energy across states?

Part 2: Data Preparation and Cleaning

```
# getting working directory
getwd()
```

```
[1] "/Users/jacobbjurstrom/ev-power-JacobBjurstrom"
```

```
# listing files in current working directory  
list.files()
```

```
[1] "data"                "ev-dashboard.qmd"    "project.qmd"  
[4] "README.md"           "report_jb.pdf"       "report_jb.qmd"  
[7] "report_jb.rmarkdown" "report.qmd"          "worksheet.qmd"
```

```
# setting new working directory  
setwd("/Users/jacobbjurstrom/ev-power-JacobBjurstrom/data")  
  
# loading data for renewable energy use between 2021 - 2023  
renew_use_21 <- read.csv("renew-use-2021.csv")  
renew_use_22 <- read.csv("renew-use-2022.csv")  
renew_use_23 <- read.csv("renew-use-2023.csv")  
  
# loading data for total energy use between 2021 - 2023  
tot_use_21 <- read.csv("total-use-2021.csv")  
tot_use_22 <- read.csv("total-use-2022.csv")  
tot_use_23 <- read.csv("total-use-2023.csv")  
  
# loading data for average energy prices and ev-registrations  
av_en_price_21_23 <- read.csv("av-energy-price-2021-2023.csv", header = FALSE)  
ev_regis <- read.csv("ev-registrations-by-state-2023.csv")  
  
## Better understanding structure of each dataset  
str(renew_use_21)
```

```
'data.frame': 260 obs. of 3 variables:  
 $ State      : chr  "AK" "AK" "AK" "AK" ...  
 $ Energy_Source : chr  "Biomass" "Geothermal" "Hydropower" "Solar  
Energy" ...  
 $ Renewable_Use_2021: chr  "~3153" "186 MMBtu" "5763 about" "~45" ...
```

```
str(renew_use_22)
```

```
'data.frame': 260 obs. of 3 variables:  
 $ State      : chr  "AK" "AK" "AK" "AK" ...  
 $ Energy_Source : chr  "Biomass" "Geothermal" "Hydropower" "Solar  
Energy" ...  
 $ Renewable_Use_2022: chr  "~3846" "$186" "$5846" "~57" ...
```

```
str(renew_use_23)
```

```
'data.frame': 260 obs. of 3 variables:
 $ State      : chr  "AK" "AK" "AK" "AK" ...
 $ Energy_Source : chr  "Biomass" "Geothermal" "Hydropower" "Solar
Energy" ...
 $ Renewable_Use_2023: chr  "3404 kWh" "186.0" "6051" "67" ...
```

```
head(renew_use_21)
```

	State	Energy_Source	Renewable_Use_2021
1	AK	Biomass	≈3153
2	AK	Geothermal	186 MMBtu
3	AK	Hydropower	5763 about
4	AK	Solar Energy	~45
5	AK	Wind Energy	451 USD
6	AL	Biomass	198543 est.

```
head(renew_use_22)
```

	State	Energy_Source	Renewable_Use_2022
1	AK	Biomass	≈3846
2	AK	Geothermal	\$186
3	AK	Hydropower	\$5846
4	AK	Solar Energy	~57
5	AK	Wind Energy	\$475
6	AL	Biomass	193932 USD

```
head(renew_use_23)
```

	State	Energy_Source	Renewable_Use_2023
1	AK	Biomass	3404 kWh
2	AK	Geothermal	186.0
3	AK	Hydropower	6051
4	AK	Solar Energy	67
5	AK	Wind Energy	380
6	AL	Biomass	189040 kWh

```
str(tot_use_21)
```

```

'data.frame':  5 obs. of  53 variables:
 $ Energy_Source: chr  "Coal" "Natural Gas†" "Petroleum (BTU)" "nuclear" ...
 $ AK           : int  18694 395590 261094 0 9597
 $ AL           : int  309791 739891 583042 480115 239817
 $ AR           : int  216123 360545 328271 141372 89714
 $ AZ           : int  160299 484962 606862 329868 99266
 $ CA           : int  28244 2172757 2959389 171842 810020
 $ CO           : int  252442 509970 497788 0 103955
 $ CT           : int  2880 305184 284788 179551 49306
 $ DC           : int  0 28336 18439 0 2487
 $ DE           : int  4542 82708 113641 0 7150
 $ FL           : int  200193 1591864 1748346 307811 297291
 $ GA           : int  203870 773889 922503 354085 289113
 $ HI           : int  12566 133 223014 0 20134
 $ IA           : int  264419 383424 408385 0 389787
 $ ID           : int  3051 135176 188263 0 74428
 $ IL           : int  522809 1088485 1136797 1011555 224106
 $ IN           : int  753557 869328 712427 0 157324
 $ KS           : int  219031 291797 339006 89426 135551
 $ KY           : int  548443 365875 584011 0 71744
 $ LA           : int  95856 1862349 1840835 179886 135905
 $ MA           : int  0 404301 503312 0 75370
 $ MD           : int  69186 299282 433791 156369 52732
 $ ME           : int  1588 57233 163991 0 95141
 $ MI           : int  436203 950364 814081 358114 194075
 $ MN           : int  179055 523812 561731 147286 216113
 $ MO           : int  616413 293633 607276 44766 88879
 $ MS           : int  64446 576903 384328 122771 66134
 $ MT           : int  122765 87105 176686 0 56334
 $ NC           : int  222501 637553 884299 449675 196973
 $ ND           : int  361811 191168 168682 0 92653
 $ NE           : int  216298 191008 237214 71758 158275
 $ NH           : int  3259 60116 142030 102789 38479
 $ NJ           : int  12586 697019 749892 293494 70039
 $ NM           : int  133228 285809 262885 0 62210
 $ NV           : int  35910 305212 286548 0 63647
 $ NY           : int  5370 1359437 1237451 325141 263977
 $ OH           : int  575920 1294814 1028000 182330 146858
 $ OK           : int  131695 745911 517408 0 177087
 $ OR           : int  1303 305665 317322 0 225544
 $ PA           : int  485193 1868137 1047658 791587 179589
 $ RI           : int  0 105473 76464 0 11798
 $ SC           : int  162628 349990 508147 560782 143796
 $ SD           : int  21589 96787 119505 0 127382
 $ TN           : int  225784 413554 713210 368461 135841
 $ TX           : int  968401 4773076 6783182 419363 654199
 $ UT           : int  276159 274420 304823 0 36050
 $ VA           : int  68603 699927 795296 297972 174615

```

```

$ VT      : int  0 13801 72241 0 21430
$ WA      : int 36943 384769 711662 88764 394052
$ WI      : int 286760 561076 533390 103979 145936
$ WV      : int 633582 277002 205005 0 26427
$ WY      : int 376971 161580 146274 0 37734
$ US      : int 10548957 31688203 35250685 8130913 7646167

```

```
str(tot_use_22)
```

```

'data.frame':  5 obs. of  53 variables:
 $ Energy_Source: chr  "coal Consumption" "Natural-Gas" "petroleum (btu)"
"Nuclear Energy†" ...
$ AK           : int 18615 437916 263335 0 10410
$ AL           : int 297654 787300 578431 442093 232035
$ AR           : int 211724 398099 327813 149654 90825
$ AZ           : int 154007 468038 594859 333738 101215
$ CA           : int 30049 2131372 3017944 183814 880995
$ CO           : int 233256 524890 538413 0 114917
$ CT           : int 0 307212 302881 172018 49084
$ DC           : int 0 30174 18000 0 2622
$ DE           : int 1846 89674 112026 0 7402
$ FL           : int 171953 1659544 1815529 321468 304605
$ GA           : int 180888 809618 940579 356001 293237
$ HI           : int 7680 159 241994 0 20471
$ IA           : int 227866 434374 423592 0 421784
$ ID           : int 1881 141924 190635 0 78406
$ IL           : int 496983 1134781 1138141 1032989 248541
$ IN           : int 719238 913401 699235 0 170986
$ KS           : int 226712 318779 346852 93844 151788
$ KY           : int 523276 402534 580349 0 77517
$ LA           : int 96914 2087166 1663129 168889 138209
$ MA           : int 0 432442 529154 0 80700
$ MD           : int 61932 310133 411842 154742 51255
$ ME           : int 1269 62559 166724 0 93867
$ MI           : int 423504 1087716 820709 271788 206811
$ MN           : int 184517 535010 568916 153546 229769
$ MO           : int 566940 322547 606374 92724 95312
$ MS           : int 66214 617855 383366 89856 66614
$ MT           : int 131345 93971 177009 0 60644
$ NC           : int 163029 747187 906477 445547 198165
$ ND           : int 369340 198986 170390 0 96024
$ NE           : int 223571 199260 237556 58702 168382
$ NH           : int 3864 60176 149025 114108 39863
$ NJ           : int 6199 755048 769751 295875 73187
$ NM           : int 138077 301279 255571 0 77286
$ NV           : int 35835 302315 303234 0 72734

```

```

$ NY      : int  6143 1403401 1321362 280133 269884
$ OH      : int  539587 1422175 1031807 175806 155282
$ OK      : int  106855 772405 521629 0 189654
$ OR      : int  1066 297591 315400 0 237768
$ PA      : int  435540 1936985 1108074 795783 182051
$ RI      : int  0 93829 78260 0 13264
$ SC      : int  150973 361249 495616 568055 145328
$ SD      : int  24769 98288 118593 0 129978
$ TN      : int  204725 440017 707095 372319 116472
$ TX      : int  932569 5007366 6582173 434709 751680
$ UT      : int  237870 287076 322387 0 37369
$ VA      : int  67739 665869 798162 294606 185638
$ VT      : int  0 14046 71534 0 22009
$ WA      : int  42238 381886 725931 102929 418470
$ WI      : int  232501 622144 535483 105285 150890
$ WV      : int  536642 281657 201769 0 28391
$ WY      : int  390303 172450 145723 0 42079
$ US      : int  9885694 33361871 35330835 8061020 8107353

```

```
str(tot_use_23)
```

```

'data.frame':  5 obs. of  53 variables:
 $ Energy_Source: chr  "coal_usage" "NaturalGas" "petroleum (BTU)" "nuclear-
energy †" ...
$ AK      : int  18414 448087 270391 0 10087
$ AL      : int  224926 775747 565754 476392 222189
$ AR      : int  180262 399566 327465 156492 87277
$ AZ      : int  137885 537151 599712 329474 108445
$ CA      : int  28746 2154533 2996168 185192 1065179
$ CO      : int  204826 525446 514174 0 115061
$ CT      : int  0 304924 292864 142873 48981
$ DC      : int  0 26236 17292 0 2795
$ DE      : int  338 84387 110721 0 8041
$ FL      : int  129387 1673836 1835394 312935 286306
$ GA      : int  177521 787361 980546 390663 291462
$ HI      : int  0 152 251676 0 21046
$ IA      : int  201276 446677 404172 0 414801
$ ID      : int  1144 154150 189553 0 77128
$ IL      : int  342683 1101064 1134461 1019691 245703
$ IN      : int  613533 921814 695709 0 172891
$ KS      : int  184614 309427 345807 107675 140268
$ KY      : int  481815 369986 584722 0 72603
$ LA      : int  58224 2055504 1620038 127634 138982
$ MA      : int  0 386946 525647 0 81559
$ MD      : int  30349 304669 429784 156610 53711
$ ME      : int  1295 61045 177091 0 89444

```

```

$ MI      : int  287490 1104234 810789 292615 198459
$ MN      : int  148968 536789 567072 124626 223864
$ MO      : int  442901 316512 612625 95947 90412
$ MS      : int  49606 630107 378072 122807 67305
$ MT      : int  130059 96777 173283 0 58470
$ NC      : int  153784 662302 900241 442493 186804
$ ND      : int  325716 220768 169307 0 92154
$ NE      : int  195602 206276 233599 72391 164502
$ NH      : int  1838 59589 147387 99658 38988
$ NJ      : int  0 721282 787262 296162 74408
$ NM      : int  75182 337083 251686 0 80278
$ NV      : int  29284 301655 296155 0 74878
$ NY      : int  4823 1346622 1341811 287690 272967
$ OH      : int  413577 1448857 1009729 169392 153083
$ OK      : int  63787 860217 515440 0 185378
$ OR      : int  652 327164 313013 0 236062
$ PA      : int  307604 1937041 1132958 787083 178035
$ RI      : int  0 112499 76844 0 13579
$ SC      : int  162323 346881 507146 581365 142486
$ SD      : int  22246 99752 114623 0 126540
$ TN      : int  202367 396870 702827 396522 115678
$ TX      : int  805600 5284670 6752349 425186 791211
$ UT      : int  174315 298976 324640 0 39674
$ VA      : int  46785 655997 807547 310037 183979
$ VT      : int  0 13001 70235 0 22209
$ WA      : int  49523 403038 718277 88163 365956
$ WI      : int  219995 565025 525386 101204 150965
$ WV      : int  472309 309019 206969 0 28370
$ WY      : int  366098 181395 143944 0 38474
$ US      : int  8169673 33609104 35460356 8098974 8187317

```

```
head(tot_use_21) # We will pivot longer these df
```

```

      Energy_Source  AK  AL  AR  AZ  CA  CO  CT
1      Coal  18694 309791 216123 160299 28244 252442 2880
2  Natural Gas† 395590 739891 360545 484962 2172757 509970 305184
3  Petroleum (BTU) 261094 583042 328271 606862 2959389 497788 284788
4      nuclear      0 480115 141372 329868 171842      0 179551
5 total_renewable_energy 9597 239817 89714 99266 810020 103955 49306
      DC  DE  FL  GA  HI  IA  ID  IL  IN  KS
KY
1      0  4542 200193 203870 12566 264419 3051 522809 753557 219031
548443
2 28336 82708 1591864 773889 133 383424 135176 1088485 869328 291797
365875
3 18439 113641 1748346 922503 223014 408385 188263 1136797 712427 339006

```

```

584011
4      0      0 307811 354085      0      0      0 1011555      0 89426
0
5 2487   7150 297291 289113 20134 389787 74428 224106 157324 135551
71744
      LA      MA      MD      ME      MI      MN      MO      MS      MT      NC
ND
1 95856      0 69186   1588 436203 179055 616413 64446 122765 222501
361811
2 1862349 404301 299282 57233 950364 523812 293633 576903 87105 637553
191168
3 1840835 503312 433791 163991 814081 561731 607276 384328 176686 884299
168682
4 179886      0 156369      0 358114 147286 44766 122771      0 449675
0
5 135905 75370 52732 95141 194075 216113 88879 66134 56334 196973
92653
      NE      NH      NJ      NM      NV      NY      OH      OK      OR      PA
1 216298 3259 12586 133228 35910 5370 575920 131695 1303 485193
2 191008 60116 697019 285809 305212 1359437 1294814 745911 305665 1868137
3 237214 142030 749892 262885 286548 1237451 1028000 517408 317322 1047658
4 71758 102789 293494      0      0 325141 182330      0      0 791587
5 158275 38479 70039 62210 63647 263977 146858 177087 225544 179589
      RI      SC      SD      TN      TX      UT      VA      VT      WA      WI      WV
1      0 162628 21589 225784 968401 276159 68603      0 36943 286760 633582
2 105473 349990 96787 413554 4773076 274420 699927 13801 384769 561076 277002
3 76464 508147 119505 713210 6783182 304823 795296 72241 711662 533390 205005
4      0 560782      0 368461 419363      0 297972      0 88764 103979      0
5 11798 143796 127382 135841 654199 36050 174615 21430 394052 145936 26427
      WY      US
1 376971 10548957
2 161580 31688203
3 146274 35250685
4      0 8130913
5 37734 7646167

```

```

head(tot_use_22) # We will pivot longer these df

```

```

      Energy_Source      AK      AL      AR      AZ      CA      CO      CT      DC
1 coal Consumption 18615 297654 211724 154007 30049 233256      0      0
2   Natural-Gas 437916 787300 398099 468038 2131372 524890 307212 30174
3 petroleum (btu) 263335 578431 327813 594859 3017944 538413 302881 18000
4 Nuclear Energy†      0 442093 149654 333738 183814      0 172018      0
5 total_renewables 10410 232035 90825 101215 880995 114917 49084 2622
      DE      FL      GA      HI      IA      ID      IL      IN      KS      KY
1 1846 171953 180888 7680 227866 1881 496983 719238 226712 523276

```


2	89674	1659544	809618	159	434374	141924	1134781	913401	318779	402534	
3	112026	1815529	940579	241994	423592	190635	1138141	699235	346852	580349	
4	0	321468	356001	0	0	0	1032989	0	93844	0	
5	7402	304605	293237	20471	421784	78406	248541	170986	151788	77517	
	LA	MA	MD	ME	MI	MN	MO	MS	MT	NC	
1	96914	0	61932	1269	423504	184517	566940	66214	131345	163029	
2	2087166	432442	310133	62559	1087716	535010	322547	617855	93971	747187	
3	1663129	529154	411842	166724	820709	568916	606374	383366	177009	906477	
4	168889	0	154742	0	271788	153546	92724	89856	0	445547	
5	138209	80700	51255	93867	206811	229769	95312	66614	60644	198165	
	ND	NE	NH	NJ	NM	NV	NY	OH	OK	OR	
1	369340	223571	3864	6199	138077	35835	6143	539587	106855	1066	
2	198986	199260	60176	755048	301279	302315	1403401	1422175	772405	297591	
3	170390	237556	149025	769751	255571	303234	1321362	1031807	521629	315400	
4	0	58702	114108	295875	0	0	280133	175806	0	0	
5	96024	168382	39863	73187	77286	72734	269884	155282	189654	237768	
	PA	RI	SC	SD	TN	TX	UT	VA	VT	WA	WI
1	435540	0	150973	24769	204725	932569	237870	67739	0	42238	232501
2	1936985	93829	361249	98288	440017	5007366	287076	665869	14046	381886	622144
3	1108074	78260	495616	118593	707095	6582173	322387	798162	71534	725931	535483
4	795783	0	568055	0	372319	434709	0	294606	0	102929	105285
5	182051	13264	145328	129978	116472	751680	37369	185638	22009	418470	150890
	WV	WY	US								
1	536642	390303	9885694								
2	281657	172450	33361871								
3	201769	145723	35330835								
4	0	0	8061020								
5	28391	42079	8107353								

```
head(tot_use_23) # We will pivot longer these df
```

	Energy_Source	AK	AL	AR	AZ	CA	CO	CT		
1	coal_usage	18414	224926	180262	137885	28746	204826	0		
2	NaturalGas	448087	775747	399566	537151	2154533	525446	304924		
3	petroleum (BTU)	270391	565754	327465	599712	2996168	514174	292864		
4	nuclear-energy †	0	476392	156492	329474	185192	0	142873		
5	total renewable-energy	10087	222189	87277	108445	1065179	115061	48981		
	DC	DE	FL	GA	HI	IA	ID	IL	IN	KS
KY										
1	0	338	129387	177521	0	201276	1144	342683	613533	184614
	481815									
2	26236	84387	1673836	787361	152	446677	154150	1101064	921814	309427
	369986									
3	17292	110721	1835394	980546	251676	404172	189553	1134461	695709	345807
	584722									
4	0	0	312935	390663	0	0	0	1019691	0	107675

```

0
5 2795 8041 286306 291462 21046 414801 77128 245703 172891 140268
72603
      LA      MA      MD      ME      MI      MN      MO      MS      MT      NC
1  58224      0  30349  1295  287490 148968 442901  49606 130059 153784
2 2055504 386946 304669  61045 1104234 536789 316512 630107  96777 662302
3 1620038 525647 429784 177091  810789 567072 612625 378072 173283 900241
4  127634      0 156610      0  292615 124626  95947 122807      0 442493
5  138982  81559  53711  89444  198459 223864  90412  67305  58470 186804
      ND      NE      NH      NJ      NM      NV      NY      OH      OK      OR
1 325716 195602  1838      0  75182  29284  4823  413577  63787  652
2 220768 206276  59589 721282 337083 301655 1346622 1448857 860217 327164
3 169307 233599 147387 787262 251686 296155 1341811 1009729 515440 313013
4      0  72391  99658 296162      0      0  287690 169392      0      0
5  92154 164502  38988 74408  80278 74878 272967 153083 185378 236062
      PA      RI      SC      SD      TN      TX      UT      VA      VT      WA
WI
1  307604      0 162323  22246 202367  805600 174315  46785      0 49523
219995
2 1937041 112499 346881  99752 396870 5284670 298976 655997 13001 403038
565025
3 1132958 76844 507146 114623 702827 6752349 324640 807547 70235 718277
525386
4  787083      0 581365      0 396522  425186      0 310037      0 88163
101204
5  178035  13579 142486 126540 115678  791211  39674 183979 22209 365956
150965
      WV      WY      US
1 472309 366098  8169673
2 309019 181395 33609104
3 206969 143944 35460356
4      0      0  8098974
5  28370  38474  8187317

```

```
str(ev_regis)
```

```

'data.frame':  54 obs. of  2 variables:
 $ electric.vehicle.registrations_by_state..2023.: chr  "" "STATE" "Alabama"
"Alaska" ...
 $ X                                               : chr  "" "Count-EVs "
"#13047" "~2697" ...

```

```
head(ev_regis)
```

```
electric.vehicle.registrations_by_state..2023.      X
1
2                STATE Count-EVs
3            Alabama    #13047
4            Alaska     ~2697
5            Arizona     89798
6            Arkansas   7108 EVs
```

```
str(av_en_price_21_23)
```

```
'data.frame':  55 obs. of  1 variable:
 $ V1: chr  "Total energy average price, dollars per million Btu,,," " ,,,,"
"State,2021,2022,2023" "AK,$20.03 per MMBtu,$27.33,$23.84 est." ...
```

```
head(av_en_price_21_23)
```

```

                                V1
1 Total energy average price, dollars per million Btu,,,
2                                ,,,
3                                State,2021,2022,2023
4                                AK,$20.03 per MMBtu,$27.33,$23.84 est.
5                                AL,about 17.85 USD,23.37 USD,≈21.11
6                                AR,$18.42,$23.84 per MMBtu,$21.76
```

```
## Starting to clean each dataset

## Renewable energy usage datasets
# We have to standardize the values in the column "Renewable_Use_2021"
renew_use_21u <- renew_use_21 %>% mutate(renewable_use_21 =
str_extract(Renewable_Use_2021, "[0-9]+"))

# repeating the same process for 2022 and 2023
renew_use_22u <- renew_use_22 %>% mutate(renewable_use_22 =
str_extract(Renewable_Use_2022, "[0-9]+"))

renew_use_23u <- renew_use_23 %>% mutate(renewable_use_23 =
str_extract(Renewable_Use_2023, "[0-9]+"), State = str_to_upper(State))

# Cleaning EV registrations by state dataframe

# Renaming columns and deleting first 2 rows
colnames(ev_regis)
```

```
[1] "electric.vehicle.registrations_by_state..2023."
[2] "X"
```

```
head(ev_regis)
```

```
electric.vehicle.registrations_by_state..2023.      X
1
2              STATE Count-EVs
3      Alabama      #13047
4      Alaska       ~2697
5      Arizona      89798
6      Arkansas     7108 EVs
```

```
ev_regis_u <- ev_regis %>% rename(ev_registration_state =
electric.vehicle.registrations_by_state..2023., ev_count = X) %>% slice(-c(1,
2))
```

```
# Only extracting ev registrations values
ev_regis_by_state <- ev_regis_u %>% mutate(ev_count_u = str_extract(ev_count,
"[0-9]+"))
```

```
## Cleaning average energy price dataframe
colnames(av_en_price_21_23)
```

```
[1] "V1"
```

```
# removing first two rows
av_price <- av_en_price_21_23 %>% slice(-c(1:2))
```

```
# separating each column
colnames(av_price)
```

```
[1] "V1"
```

```
av_price_u <- av_price %>% separate(V1, into = c("State", "2021", "2022",
"2023"), sep = ",") %>% slice(-c(1))
```

```
# Only extracting relevant variables for the column data
av_priceu <- av_price_u %>% mutate(two_one = str_extract(`2021`, "[0-9]+\\.
[0-9]+"), two_two = str_extract(`2022`, "[0-9]+\\. [0-9]+"), two_three =
str_extract(`2023`, "[0-9]+\\. [0-9]+")) %>% select(-c(2, 3, 4))
```

Part 3: Joining / Pivoting Datasets for Analysis

```
## Joining the renewable energy usage datasets
head(renew_use_21u)
```

	State	Energy_Source	Renewable_Use_2021	renewable_use_21
1	AK	Biomass	≈3153	3153
2	AK	Geothermal	186 MMBtu	186
3	AK	Hydropower	5763 about	5763
4	AK	Solar Energy	~45	45
5	AK	Wind Energy	451 USD	451
6	AL	Biomass	198543 est.	198543

```
# using a left join to join 2021 and 2022 data
df_21_22 <- left_join(x=renew_use_21u, y=renew_use_22u, by = join_by(State ==
State, Energy_Source == Energy_Source)) %>% select(-c("Renewable_Use_2021",
"Renewable_Use_2022"))

# using another left join to join df_21_22 and 2023 data
df_21_23 <- left_join(x=df_21_22, y=renew_use_23u, by = join_by(State ==
State, Energy_Source == Energy_Source)) %>% select(-c("Renewable_Use_2023"))

## Calculating the total number of renewable energy used by state for each
respective year
tot_ren_state <- df_21_23 %>%
  mutate(across(starts_with("renewable_use"), as.numeric)) %>%
  group_by(State) %>%
  summarize(
    total_21 = sum(renewable_use_21, na.rm = TRUE),
    total_22 = sum(renewable_use_22, na.rm = TRUE),
    total_23 = sum(renewable_use_23, na.rm = TRUE)
  )

## Pivoting the total energy usage dataframes
tot_use_21l <- tot_use_21 %>% pivot_longer(cols = -Energy_Source, names_to =
"State", values_to = "Tot_usage_21") %>% group_by(State) %>% arrange(State)

## Repeating the same process for 2022 and 2023
tot_use_22l <- tot_use_22 %>% pivot_longer(cols = -Energy_Source, names_to =
"State", values_to = "Tot_usage_22") %>% group_by(State) %>% arrange(State)

tot_use_23l <- tot_use_23 %>% pivot_longer(cols = -Energy_Source, names_to =
"State", values_to = "Tot_usage_23") %>% group_by(State) %>% arrange(State)
```

Part 4: Mapping Visualization

```
# loading packages  
library(maps)
```

Warning: package 'maps' was built under R version 4.3.3

Attaching package: 'maps'

The following object is masked from 'package:purrr':

map

```
# creating maps  
us_map <- map_data("state")  
  
ggplot(us_map, aes(long, lat)) + geom_polygon(color = "white") +  
coord_fixed(1.3) + theme_minimal() + labs(title = "Average Income by State")
```

