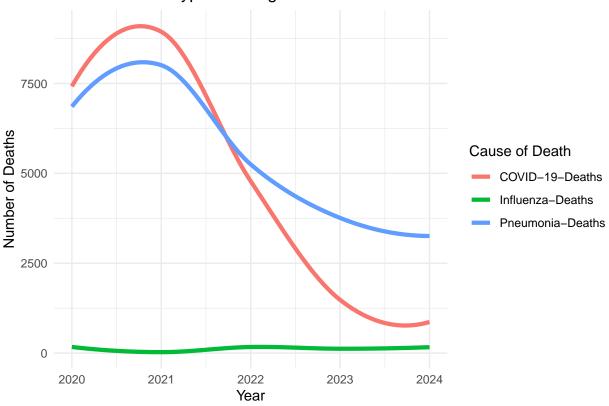
State_by_year

2025-02-12

```
library(ggplot2)
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library(tidyr)
library(readxl)
library(latexpdf)
library(tinytex)
Covid_Year <- read_excel("C:/Users/Union Loaner #06/Desktop/Spring 2025/capstone 2/This semester projections."
View(Covid_Year)
Covid_Year <- Covid_Year %>%
  mutate(Year = as.numeric(Year))
# Select columns by index rather than by name
df_long <- Covid_Year[, c("Year", "COVID-19-Deaths", "Pneumonia-Deaths", "Influenza-Deaths")] %>%
  pivot_longer(cols = c("COVID-19-Deaths", "Pneumonia-Deaths", "Influenza-Deaths"),
               names_to = "cause_of_death",
               values_to = "deaths")
# Create a smooth trend line graph to show trends of death types throughout the years
ggplot(df_long, aes(x = Year, y = deaths, color = cause_of_death, group = cause_of_death)) +
  geom_smooth(se = FALSE, method = "loess", linewidth = 1.5) +
  labs(title = "Trend of Death Types Throughout the Years",
       x = "Year",
       y = "Number of Deaths",
       color = "Cause of Death") +
  theme_minimal()
```

'geom_smooth()' using formula = 'y ~ x'

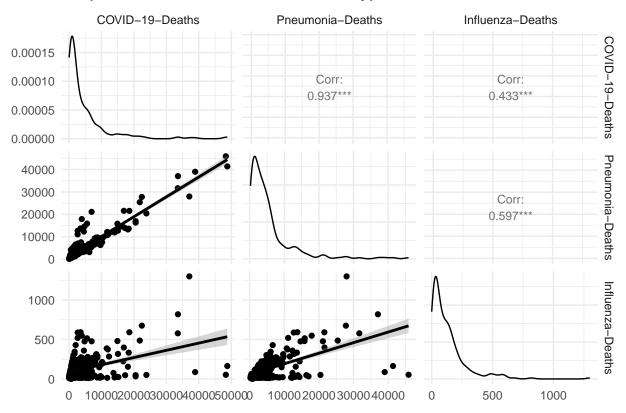




```
str(df_long)
```

```
## tibble [780 x 3] (S3: tbl_df/tbl/data.frame)
                    : num [1:780] 2020 2020 2020 2021 2021 ...
    $ cause_of_death: chr [1:780] "COVID-19-Deaths" "Pneumonia-Deaths" "Influenza-Deaths" "COVID-19-Dea
    $ deaths
                   : num [1:780] 6706 5213 140 9719 6356 ...
library(ggplot2)
library(GGally)
## Registered S3 method overwritten by 'GGally':
     method from
##
##
     +.gg ggplot2
##
## Attaching package: 'GGally'
## The following object is masked from 'package:latexpdf':
##
##
       wrap
# Select relevant columns for correlation analysis
df_numeric <- Covid_Year[, c("COVID-19-Deaths", "Pneumonia-Deaths", "Influenza-Deaths")]
```

Graphical Correlation Matrix of Death Types

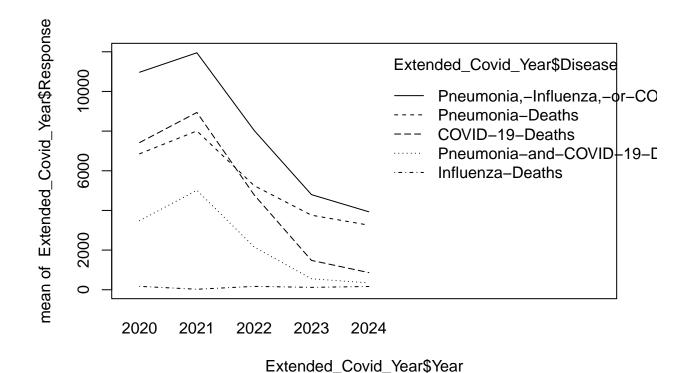


```
library(tidyr)
library(dplyr)
library(writexl)
```

Warning: package 'writexl' was built under R version 4.4.3

```
## 1 By Year
              2020 Alabama
                                     63362 COVID-19-Deaths
                                                                                  6706
## 2 By Year
              2020 Alabama
                                     63362 Pneumonia-Deaths
                                                                                  5213
              2020 Alabama
                                     63362 Influenza-Deaths
## 3 By Year
                                                                                   140
                                     63362 Pneumonia-and-COVID-19-Deaths
## 4 By Year
              2020 Alabama
                                                                                  2177
## 5 By Year
              2020 Alabama
                                     63362 Pneumonia, -Influenza, -or-COVID-~
                                                                                  9870
## 6 By Year
              2021 Alabama
                                     67323 COVID-19-Deaths
                                                                                  9719
```

interaction.plot(Extended_Covid_Year\$Year,Extended_Covid_Year\$Disease,Extended_Covid_Year\$Response)



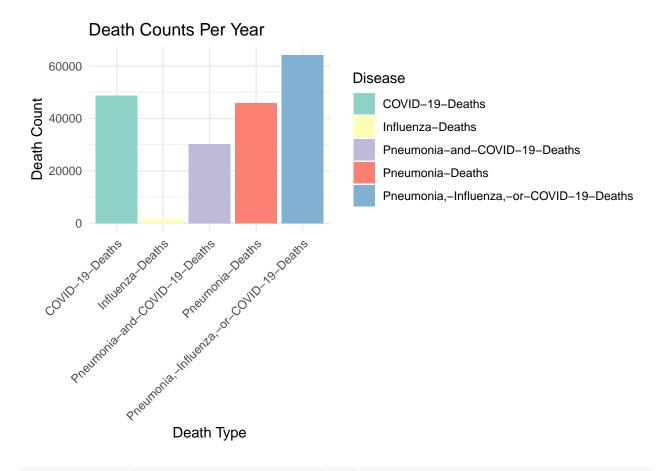
P_model <- glm(Response ~ as.factor(Year) * Disease, family = poisson, data = Extended_Covid_Year) summary(P_model)

```
##
   glm(formula = Response ~ as.factor(Year) * Disease, family = poisson,
       data = Extended_Covid_Year)
##
##
##
  Coefficients:
##
                                                                           Estimate
## (Intercept)
                                                                           8.912116
## as.factor(Year)2021
                                                                          0.186244
## as.factor(Year)2022
                                                                          -0.439602
## as.factor(Year)2023
                                                                          -1.611942
## as.factor(Year)2024
                                                                          -2.148875
## DiseaseInfluenza-Deaths
                                                                          -3.771352
```

```
## DiseasePneumonia-and-COVID-19-Deaths
                                                                        -0.756080
## DiseasePneumonia-Deaths
                                                                        -0.079256
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                         0.390646
## as.factor(Year)2021:DiseaseInfluenza-Deaths
                                                                        -2.052770
## as.factor(Year)2022:DiseaseInfluenza-Deaths
                                                                         0.436445
## as.factor(Year)2023:DiseaseInfluenza-Deaths
                                                                         1.268239
## as.factor(Year)2024:DiseaseInfluenza-Deaths
                                                                         2.110554
## as.factor(Year)2021:DiseasePneumonia-and-COVID-19-Deaths
                                                                         0.178292
## as.factor(Year)2022:DiseasePneumonia-and-COVID-19-Deaths
                                                                        -0.041557
## as.factor(Year)2023:DiseasePneumonia-and-COVID-19-Deaths
                                                                        -0.225819
## as.factor(Year)2024:DiseasePneumonia-and-COVID-19-Deaths
                                                                        -0.162057
## as.factor(Year)2021:DiseasePneumonia-Deaths
                                                                        -0.030807
## as.factor(Year)2022:DiseasePneumonia-Deaths
                                                                         0.172572
## as.factor(Year)2023:DiseasePneumonia-Deaths
                                                                         1.011184
## as.factor(Year)2024:DiseasePneumonia-Deaths
                                                                         1.404713
## as.factor(Year)2021:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths -0.100588
## as.factor(Year)2022:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                         0.128089
## as.factor(Year)2023:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
## as.factor(Year)2024:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                        1.122992
                                                                        Std. Error
## (Intercept)
                                                                          0.001610
## as.factor(Year)2021
                                                                          0.002178
## as.factor(Year)2022
                                                                          0.002572
## as.factor(Year)2023
                                                                          0.003947
## as.factor(Year)2024
                                                                          0.004981
## DiseaseInfluenza-Deaths
                                                                          0.010731
## DiseasePneumonia-and-COVID-19-Deaths
                                                                          0.002848
## DiseasePneumonia-Deaths
                                                                          0.002323
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                          0.002084
## as.factor(Year)2021:DiseaseInfluenza-Deaths
                                                                          0.029071
## as.factor(Year)2022:DiseaseInfluenza-Deaths
                                                                          0.015235
## as.factor(Year)2023:DiseaseInfluenza-Deaths
                                                                          0.016937
## as.factor(Year)2024:DiseaseInfluenza-Deaths
                                                                          0.015948
## as.factor(Year)2021:DiseasePneumonia-and-COVID-19-Deaths
                                                                          0.003754
## as.factor(Year)2022:DiseasePneumonia-and-COVID-19-Deaths
                                                                          0.004589
## as.factor(Year)2023:DiseasePneumonia-and-COVID-19-Deaths
                                                                          0.007468
## as.factor(Year)2024:DiseasePneumonia-and-COVID-19-Deaths
                                                                          0.009273
## as.factor(Year)2021:DiseasePneumonia-Deaths
                                                                          0.003154
## as.factor(Year)2022:DiseasePneumonia-Deaths
                                                                          0.003617
## as.factor(Year)2023:DiseasePneumonia-Deaths
                                                                          0.004848
## as.factor(Year)2024:DiseasePneumonia-Deaths
                                                                          0.005790
## as.factor(Year)2021:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          0.002847
## as.factor(Year)2022:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          0.003280
## as.factor(Year)2023:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          0.004620
## as.factor(Year)2024:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          0.005609
##
                                                                         z value
## (Intercept)
                                                                        5536.400
## as.factor(Year)2021
                                                                          85.525
## as.factor(Year)2022
                                                                        -170.945
## as.factor(Year)2023
                                                                        -408.380
## as.factor(Year)2024
                                                                        -431.401
## DiseaseInfluenza-Deaths
                                                                        -351.449
## DiseasePneumonia-and-COVID-19-Deaths
                                                                        -265.492
## DiseasePneumonia-Deaths
                                                                         -34.118
```

```
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                          187.418
## as.factor(Year)2021:DiseaseInfluenza-Deaths
                                                                          -70.613
                                                                          28.648
## as.factor(Year)2022:DiseaseInfluenza-Deaths
## as.factor(Year)2023:DiseaseInfluenza-Deaths
                                                                          74.879
## as.factor(Year)2024:DiseaseInfluenza-Deaths
                                                                          132.342
## as.factor(Year)2021:DiseasePneumonia-and-COVID-19-Deaths
                                                                          47.491
## as.factor(Year)2022:DiseasePneumonia-and-COVID-19-Deaths
                                                                          -9.055
## as.factor(Year)2023:DiseasePneumonia-and-COVID-19-Deaths
                                                                          -30.238
## as.factor(Year)2024:DiseasePneumonia-and-COVID-19-Deaths
                                                                          -17.477
## as.factor(Year)2021:DiseasePneumonia-Deaths
                                                                          -9.767
## as.factor(Year)2022:DiseasePneumonia-Deaths
                                                                          47.713
## as.factor(Year)2023:DiseasePneumonia-Deaths
                                                                          208.592
## as.factor(Year)2024:DiseasePneumonia-Deaths
                                                                          242,623
## as.factor(Year)2021:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                         -35.333
## as.factor(Year)2022:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          39.048
## as.factor(Year)2023:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          169.906
## as.factor(Year)2024:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                         200.228
##
                                                                        Pr(>|z|)
## (Intercept)
                                                                          <2e-16
## as.factor(Year)2021
                                                                           <2e-16
## as.factor(Year)2022
                                                                          <2e-16
## as.factor(Year)2023
                                                                          <2e-16
## as.factor(Year)2024
                                                                          <2e-16
## DiseaseInfluenza-Deaths
                                                                           <2e-16
## DiseasePneumonia-and-COVID-19-Deaths
                                                                          <2e-16
## DiseasePneumonia-Deaths
                                                                          <2e-16
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                          <2e-16
## as.factor(Year)2021:DiseaseInfluenza-Deaths
                                                                           <2e-16
## as.factor(Year)2022:DiseaseInfluenza-Deaths
                                                                          <2e-16
## as.factor(Year)2023:DiseaseInfluenza-Deaths
                                                                          <2e-16
## as.factor(Year)2024:DiseaseInfluenza-Deaths
                                                                          <2e-16
## as.factor(Year)2021:DiseasePneumonia-and-COVID-19-Deaths
                                                                           <2e-16
## as.factor(Year)2022:DiseasePneumonia-and-COVID-19-Deaths
                                                                          <2e-16
## as.factor(Year)2023:DiseasePneumonia-and-COVID-19-Deaths
                                                                          <2e-16
## as.factor(Year)2024:DiseasePneumonia-and-COVID-19-Deaths
                                                                           <2e-16
## as.factor(Year)2021:DiseasePneumonia-Deaths
                                                                           <2e-16
## as.factor(Year)2022:DiseasePneumonia-Deaths
                                                                          <2e-16
## as.factor(Year)2023:DiseasePneumonia-Deaths
                                                                          <2e-16
## as.factor(Year)2024:DiseasePneumonia-Deaths
                                                                           <2e-16
## as.factor(Year)2021:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                           <2e-16
## as.factor(Year)2022:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                           <2e-16
## as.factor(Year)2023:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                           <2e-16
## as.factor(Year)2024:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                           <2e-16
##
## (Intercept)
## as.factor(Year)2021
                                                                        ***
## as.factor(Year)2022
## as.factor(Year)2023
## as.factor(Year)2024
                                                                         ***
## DiseaseInfluenza-Deaths
## DiseasePneumonia-and-COVID-19-Deaths
                                                                         ***
## DiseasePneumonia-Deaths
                                                                         ***
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                        ***
## as.factor(Year)2021:DiseaseInfluenza-Deaths
```

```
## as.factor(Year)2022:DiseaseInfluenza-Deaths
## as.factor(Year)2023:DiseaseInfluenza-Deaths
## as.factor(Year)2024:DiseaseInfluenza-Deaths
## as.factor(Year)2021:DiseasePneumonia-and-COVID-19-Deaths
## as.factor(Year)2022:DiseasePneumonia-and-COVID-19-Deaths
## as.factor(Year)2023:DiseasePneumonia-and-COVID-19-Deaths
## as.factor(Year)2024:DiseasePneumonia-and-COVID-19-Deaths
## as.factor(Year)2021:DiseasePneumonia-Deaths
                                                                       ***
## as.factor(Year)2022:DiseasePneumonia-Deaths
## as.factor(Year)2023:DiseasePneumonia-Deaths
                                                                       ***
## as.factor(Year)2024:DiseasePneumonia-Deaths
## as.factor(Year)2021:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths ***
## as.factor(Year)2022:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths ***
## as.factor(Year)2023:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths ***
## as.factor(Year)2024:DiseasePneumonia,-Influenza,-or-COVID-19-Deaths ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 9567386 on 1299 degrees of freedom
## Residual deviance: 5111728 on 1275 degrees of freedom
## AIC: 5123264
## Number of Fisher Scoring iterations: 5
expected_counts <- predict(P_model, type = "response")</pre>
head(expected counts)
##
                       2
                                  3
## 7421.3462 6855.8654
                           170.8462 3484.3462 10968.2692 8940.6154
library(ggplot2)
ggplot(Extended_Covid_Year, aes(x = Disease, y = `Response`, fill = Disease)) +
  geom_bar(stat = "identity", position = "dodge") +
  theme_minimal() +
  labs(title = "Death Counts Per Year",
      x = "Death Type",
      y = "Death Count") +
  scale_fill_brewer(palette = "Set3") +
  theme(axis.text.x = element_text(angle = 45, hjust = 1))
```



model_qp <- glm(Response~Disease*as.factor(Year), family = quasipoisson,data = Extended_Covid_Year)
summary(model_qp)</pre>

```
## Call:
  glm(formula = Response ~ Disease * as.factor(Year), family = quasipoisson,
       data = Extended_Covid_Year)
##
##
## Coefficients:
                                                                         Estimate
##
## (Intercept)
                                                                          8.91212
## DiseaseInfluenza-Deaths
                                                                         -3.77135
## DiseasePneumonia-and-COVID-19-Deaths
                                                                         -0.75608
## DiseasePneumonia-Deaths
                                                                         -0.07926
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                          0.39065
## as.factor(Year)2021
                                                                          0.18624
## as.factor(Year)2022
                                                                         -0.43960
## as.factor(Year)2023
                                                                         -1.61194
## as.factor(Year)2024
                                                                         -2.14888
                                                                         -2.05277
## DiseaseInfluenza-Deaths:as.factor(Year)2021
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                          0.17829
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                         -0.03081
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2021 -0.10059
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                          0.43645
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                         -0.04156
```

##

```
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                         0.17257
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2022 0.12809
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                         1.26824
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                        -0.22582
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                         1.01118
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2023 0.78493
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                         2.11055
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                        -0.16206
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                         1.40471
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2024 1.12299
                                                                        Std. Error
## (Intercept)
                                                                           0.11741
## DiseaseInfluenza-Deaths
                                                                            0.78271
## DiseasePneumonia-and-COVID-19-Deaths
                                                                            0.20772
## DiseasePneumonia-Deaths
                                                                            0.16944
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                            0.15203
## as.factor(Year)2021
                                                                            0.15884
## as.factor(Year)2022
                                                                            0.18757
## as.factor(Year)2023
                                                                           0.28791
## as.factor(Year)2024
                                                                            0.36333
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                            2.12042
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                            0.27383
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                            0.23006
## DiseasePneumonia.-Influenza.-or-COVID-19-Deaths:as.factor(Year)2021
                                                                            0.20765
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                            1.11121
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                            0.33475
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                            0.26381
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2022
                                                                            0.23927
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                            1.23541
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                            0.54473
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                            0.35359
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2023
                                                                            0.33697
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                            1.16323
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                            0.67636
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                            0.42230
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2024
                                                                           0.40909
##
                                                                        t value
                                                                         75.903
## (Intercept)
## DiseaseInfluenza-Deaths
                                                                         -4.818
## DiseasePneumonia-and-COVID-19-Deaths
                                                                         -3.640
## DiseasePneumonia-Deaths
                                                                         -0.468
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                          2.569
## as.factor(Year)2021
                                                                          1.173
## as.factor(Year)2022
                                                                         -2.344
## as.factor(Year)2023
                                                                         -5.599
## as.factor(Year)2024
                                                                         -5.914
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                         -0.968
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                          0.651
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                         -0.134
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2021
                                                                         -0.484
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                          0.393
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                         -0.124
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                          0.654
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2022
                                                                          0.535
```

```
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                          1.027
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                         -0.415
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                          2.860
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2023
                                                                          2.329
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                          1.814
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                         -0.240
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                          3.326
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths: as.factor(Year)2024
                                                                          2.745
##
                                                                        Pr(>|t|)
## (Intercept)
                                                                         < 2e-16
## DiseaseInfluenza-Deaths
                                                                        1.62e-06
## DiseasePneumonia-and-COVID-19-Deaths
                                                                        0.000284
## DiseasePneumonia-Deaths
                                                                        0.640039
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                        0.010298
## as.factor(Year)2021
                                                                        0.241199
## as.factor(Year)2022
                                                                        0.019250
## as.factor(Year)2023
                                                                        2.64e-08
## as.factor(Year)2024
                                                                        4.27e-09
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                        0.333181
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                        0.515101
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                        0.893497
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2021 0.628181
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                        0.694558
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                        0.901220
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                        0.513139
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2022 0.592510
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                        0.304815
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                        0.678538
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                        0.004309
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2023 0.019994
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                        0.069853
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                        0.810678
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                        0.000905
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2024 0.006134
## (Intercept)
                                                                        ***
## DiseaseInfluenza-Deaths
## DiseasePneumonia-and-COVID-19-Deaths
                                                                         ***
## DiseasePneumonia-Deaths
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
## as.factor(Year)2021
## as.factor(Year)2022
## as.factor(Year)2023
## as.factor(Year)2024
                                                                        ***
## DiseaseInfluenza-Deaths:as.factor(Year)2021
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
## DiseasePneumonia-Deaths:as.factor(Year)2021
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2021
## DiseaseInfluenza-Deaths:as.factor(Year)2022
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
## DiseasePneumonia-Deaths:as.factor(Year)2022
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2022
## DiseaseInfluenza-Deaths:as.factor(Year)2023
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
```

```
## DiseasePneumonia-Deaths:as.factor(Year)2023
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2023 *
## DiseaseInfluenza-Deaths:as.factor(Year)2024
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
## DiseasePneumonia-Deaths:as.factor(Year)2024
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2024 **
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for quasipoisson family taken to be 5320.285)
       Null deviance: 9567386 on 1299 degrees of freedom
## Residual deviance: 5111728 on 1275 degrees of freedom
## AIC: NA
##
## Number of Fisher Scoring iterations: 5
library(MASS)
## Warning: package 'MASS' was built under R version 4.4.3
##
## Attaching package: 'MASS'
## The following object is masked from 'package:dplyr':
##
##
       select
model_nb_interact <- glm.nb(Response ~ Disease * as.factor(Year), data = Extended_Covid_Year)</pre>
summary(model_nb_interact)
##
## Call:
## glm.nb(formula = Response ~ Disease * as.factor(Year), data = Extended_Covid_Year,
       init.theta = 1.120514533, link = log)
## Coefficients:
##
                                                                        Estimate
## (Intercept)
                                                                         8.91212
## DiseaseInfluenza-Deaths
                                                                        -3.77135
## DiseasePneumonia-and-COVID-19-Deaths
                                                                        -0.75608
                                                                        -0.07926
## DiseasePneumonia-Deaths
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                         0.39065
## as.factor(Year)2021
                                                                         0.18624
## as.factor(Year)2022
                                                                        -0.43960
## as.factor(Year)2023
                                                                        -1.61194
## as.factor(Year)2024
                                                                        -2.14888
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                        -2.05277
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                         0.17829
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                        -0.03081
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2021 -0.10059
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                         0.43645
```

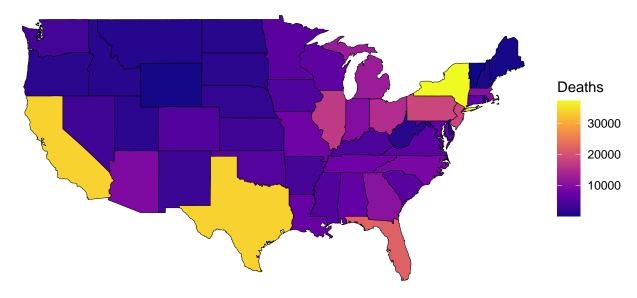
```
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                         -0.04156
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                          0.17257
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2022 0.12809
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                          1.26824
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                         -0.22582
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                          1.01118
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2023
                                                                         0.78493
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                          2.11055
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                         -0.16206
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                          1.40471
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2024 1.12299
                                                                         Std. Error
## (Intercept)
                                                                            0.13102
## DiseaseInfluenza-Deaths
                                                                            0.18558
## DiseasePneumonia-and-COVID-19-Deaths
                                                                            0.18529
## DiseasePneumonia-Deaths
                                                                            0.18528
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                            0.18528
## as.factor(Year)2021
                                                                            0.18528
## as.factor(Year)2022
                                                                            0.18529
## as.factor(Year)2023
                                                                            0.18531
## as.factor(Year)2024
                                                                            0.18534
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                            0.26362
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                            0.26204
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                            0.26203
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2021
                                                                            0.26203
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                            0.26245
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                            0.26205
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                            0.26204
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2022
                                                                            0.26203
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                            0.26256
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                            0.26212
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                            0.26206
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2023
                                                                            0.26205
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                            0.26250
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                            0.26218
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                            0.26207
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2024
                                                                            0.26207
##
                                                                         z value
## (Intercept)
                                                                          68.023
## DiseaseInfluenza-Deaths
                                                                         -20.322
## DiseasePneumonia-and-COVID-19-Deaths
                                                                          -4.080
## DiseasePneumonia-Deaths
                                                                          -0.428
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
                                                                           2.108
## as.factor(Year)2021
                                                                          1.005
## as.factor(Year)2022
                                                                          -2.373
## as.factor(Year)2023
                                                                          -8.699
## as.factor(Year)2024
                                                                         -11.594
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                          -7.787
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                          0.680
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                          -0.118
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2021
                                                                         -0.384
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                          1.663
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                          -0.159
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                           0.659
```

```
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths: as.factor(Year)2022
                                                                          0.489
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                          4.830
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                         -0.862
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                          3.859
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2023
                                                                          2.995
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                          8.040
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                         -0.618
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                          5.360
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2024
                                                                          4.285
##
                                                                        Pr(>|z|)
## (Intercept)
                                                                         < 2e-16
## DiseaseInfluenza-Deaths
                                                                         < 2e-16
## DiseasePneumonia-and-COVID-19-Deaths
                                                                        4.49e-05
## DiseasePneumonia-Deaths
                                                                        0.668831
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths
                                                                        0.034997
## as.factor(Year)2021
                                                                        0.314806
## as.factor(Year)2022
                                                                        0.017666
## as.factor(Year)2023
                                                                         < 2e-16
## as.factor(Year)2024
                                                                         < 2e-16
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                        6.87e-15
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
                                                                        0.496247
## DiseasePneumonia-Deaths:as.factor(Year)2021
                                                                        0.906409
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2021 0.701063
## DiseaseInfluenza-Deaths:as.factor(Year)2022
                                                                        0.096324
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
                                                                        0.873997
## DiseasePneumonia-Deaths:as.factor(Year)2022
                                                                        0.510165
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2022 0.624962
## DiseaseInfluenza-Deaths:as.factor(Year)2023
                                                                        1.36e-06
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
                                                                        0.388952
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                        0.000114
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2023 0.002742
## DiseaseInfluenza-Deaths:as.factor(Year)2024
                                                                        8.96e-16
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
                                                                        0.536494
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                        8.32e-08
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2024 1.83e-05
##
## (Intercept)
## DiseaseInfluenza-Deaths
                                                                         ***
## DiseasePneumonia-and-COVID-19-Deaths
## DiseasePneumonia-Deaths
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths
## as.factor(Year)2021
## as.factor(Year)2022
## as.factor(Year)2023
## as.factor(Year)2024
                                                                         ***
## DiseaseInfluenza-Deaths:as.factor(Year)2021
                                                                         ***
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2021
## DiseasePneumonia-Deaths:as.factor(Year)2021
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2021
## DiseaseInfluenza-Deaths:as.factor(Year)2022
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2022
## DiseasePneumonia-Deaths:as.factor(Year)2022
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2022
## DiseaseInfluenza-Deaths:as.factor(Year)2023
```

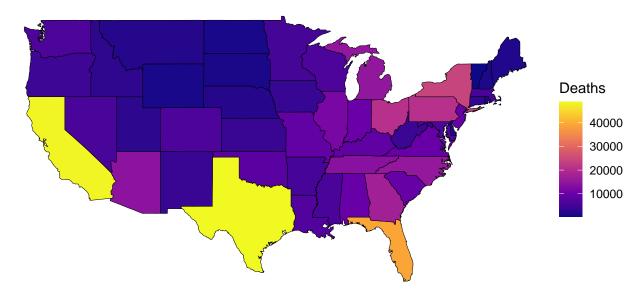
```
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2023
## DiseasePneumonia-Deaths:as.factor(Year)2023
                                                                        ***
## DiseasePneumonia, -Influenza, -or-COVID-19-Deaths:as.factor(Year)2023 **
## DiseaseInfluenza-Deaths:as.factor(Year)2024
## DiseasePneumonia-and-COVID-19-Deaths:as.factor(Year)2024
## DiseasePneumonia-Deaths:as.factor(Year)2024
                                                                        ***
## DiseasePneumonia,-Influenza,-or-COVID-19-Deaths:as.factor(Year)2024 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for Negative Binomial(1.1205) family taken to be 1)
##
       Null deviance: 3841.8 on 1299 degrees of freedom
## Residual deviance: 1478.9 on 1275 degrees of freedom
## AIC: 22162
##
## Number of Fisher Scoring iterations: 1
##
##
##
                 Theta: 1.1205
##
             Std. Err.: 0.0392
##
   2 x log-likelihood: -22109.8030
library(ggplot2)
library(usmap)
## Warning: package 'usmap' was built under R version 4.4.3
library(dplyr)
# STEP 1: Organize your data
panel_data_long <- Extended_Covid_Year %>%
  group_by(State, Year, Disease) %>%
  summarize(Deaths = sum(Response), .groups = "drop") %>%
  mutate(State = toupper(State)) # Convert state names to uppercase
# STEP 2: Visualize spatial patterns by year (Extremely Minimal Code)
selected_disease_plot <- "COVID-19-Deaths" # Choose a disease to visualize</pre>
map_data <- map_data("state") %>% rename(State = region) %>% mutate(State = toupper(State))
years <- unique(panel_data_long$Year)</pre>
for (yr in years) {
  year_data <- panel_data_long %>%
   filter(Year == yr, Disease == selected_disease_plot)
  merged_data <- map_data %>%
   left_join(year_data, by = "State")
 print(
    ggplot(merged_data, aes(long, lat, group = group, fill = Deaths)) +
```

```
geom_polygon(color = "black", linewidth = 0.1) +
    coord_quickmap() +
    scale_fill_viridis_c(option = "plasma", na.value = "lightgray") +
    labs(title = paste(selected_disease_plot, "Deaths -", yr), fill = "Deaths") +
    theme_void()
)
```

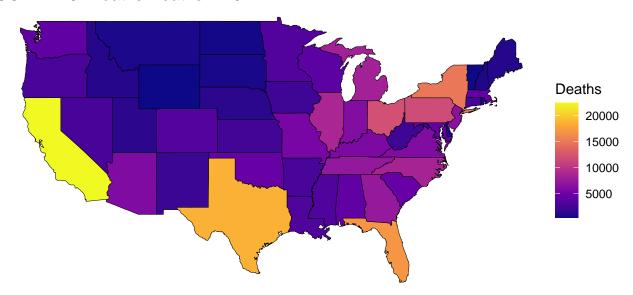
COVID-19-Deaths Deaths - 2020



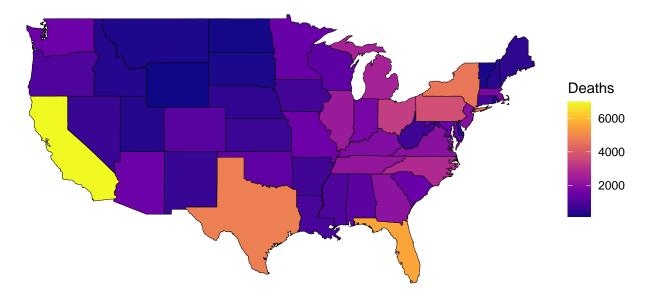
COVID-19-Deaths Deaths - 2021



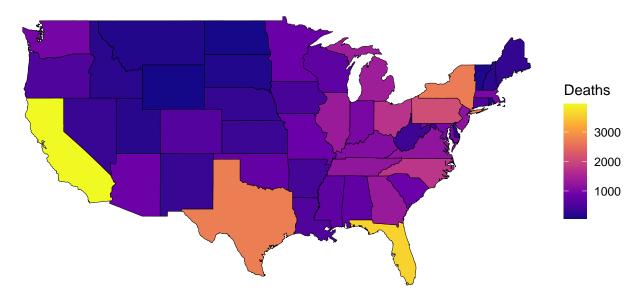
COVID-19-Deaths Deaths - 2022



COVID-19-Deaths Deaths - 2023



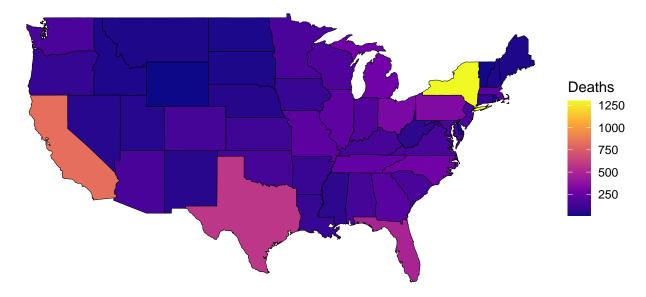
COVID-19-Deaths Deaths - 2024



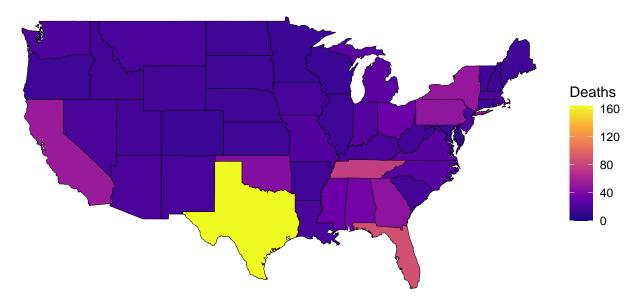
```
library(ggplot2)
library(usmap)
library(dplyr)
# STEP 1: Organize your data
panel_data_long <- Extended_Covid_Year %>%
  filter(Disease %in% c("Pneumonia-Deaths", "Influenza-Deaths")) %>%
  group_by(State, Year, Disease) %>%
  summarize(Deaths = sum(Response), .groups = "drop") %>%
  mutate(State = toupper(State)) # Convert state names to uppercase
# STEP 2: Visualize spatial patterns by year for Pneumonia and Influenza
map_data_states <- map_data("state") %>%
  mutate(state_name_upper = toupper(region))
years <- unique(panel_data_long$Year)</pre>
diseases_to_plot <- unique(panel_data_long$Disease)</pre>
for (dis in diseases_to_plot) {
  for (yr in years) {
    year_disease_data <- panel_data_long %>%
      filter(Year == yr, Disease == dis)
    merged_data <- map_data_states %>%
      left_join(year_disease_data, by = c("state_name_upper" = "State"))
```

```
print(
    ggplot(merged_data, aes(long, lat, group = group, fill = Deaths)) +
    geom_polygon(color = "black", linewidth = 0.1) +
    coord_quickmap() +
    scale_fill_viridis_c(option = "plasma", na.value = "lightgray") +
    labs(title = paste(dis, "Deaths -", yr), fill = "Deaths") +
    theme_void()
    )
}
```

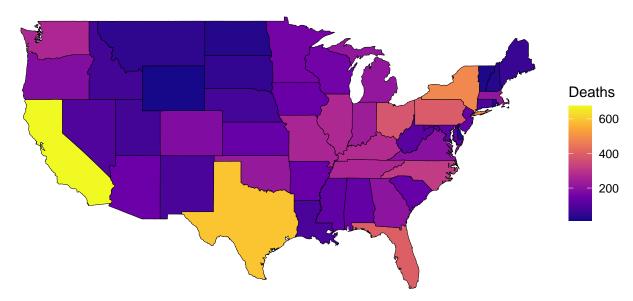
Influenza-Deaths Deaths - 2020



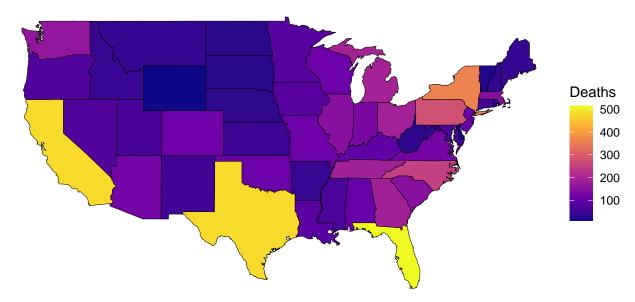
Influenza-Deaths Deaths - 2021



Influenza-Deaths Deaths - 2022



Influenza-Deaths Deaths - 2023



Influenza-Deaths Deaths - 2024

