

West Africa

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1 Install the necessary packages

```
library(tidyverse)
```

```
## -- Attaching packages ----- tidyverse 1.3.0 --

## v ggplot2 3.3.1    v purrr   0.3.4
## v tibble  3.0.1    v dplyr   0.8.5
## v tidyr   1.1.0    v stringr 1.4.0
## v readr   1.3.1    v forcats 0.5.0

## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()    masks stats::lag()
```

```
library(plotly)
```

```
##
## Attaching package: 'plotly'

## The following object is masked from 'package:ggplot2':
##
##   last_plot

## The following object is masked from 'package:stats':
##
##   filter

## The following object is masked from 'package:graphics':
##
##   layout
```

```
library(ggplot2)
library(dplyr)
library(viridis)
```

```
## Loading required package: viridisLite
```

```
library(patchwork)
library(ggpubr)
library(hrbrthemes)
```

```
## NOTE: Either Arial Narrow or Roboto Condensed fonts are required to use these themes.
```

```
##       Please use hrbrthemes::import_roboto_condensed() to install Roboto Condensed and
```

```
##       if Arial Narrow is not on your system, please see https://bit.ly/arialnarrow
```

```
library(directlabels)
library(knitr)
library(pastecs)
```

```
##
## Attaching package: 'pastecs'
```

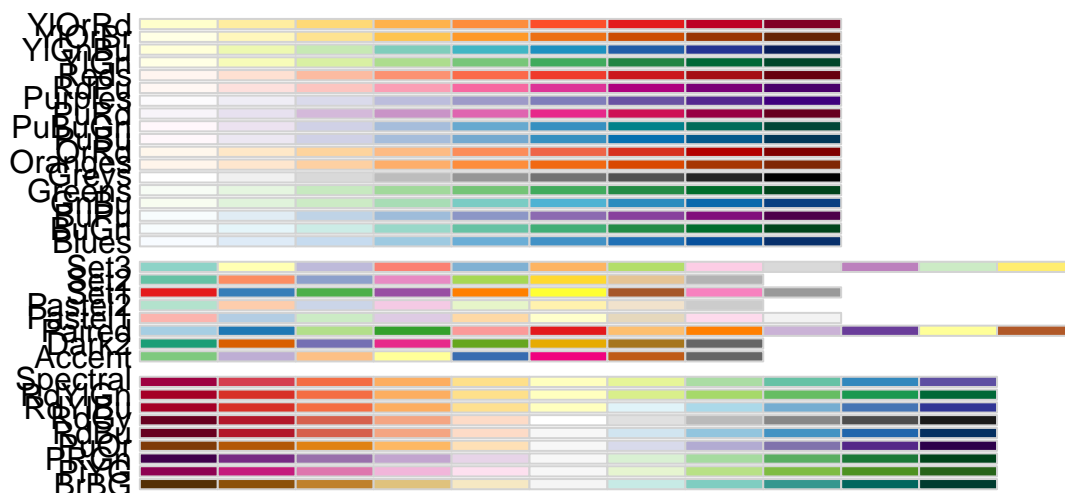
```
## The following objects are masked from 'package:dplyr':
```

```
##
## first, last
```

```
## The following object is masked from 'package:tidyr':
```

```
##
## extract
```

```
library(RColorBrewer)
display.brewer.all()
```



2 Read the file

```
WA_global <- read.csv("~/COVID-19/COVID-19_Data/coronavirus.csv",
                      header = TRUE, stringsAsFactors = FALSE)
attach(WA_global)
summary(WA_global)
```

##	Province.State	Country.Region	Lat	Long
##	Length:116180	Length:116180	Min. : -51.796	Min. : -135.00
##	Class :character	Class :character	1st Qu.: 6.611	1st Qu.: -14.45
##	Mode :character	Mode :character	Median : 22.300	Median : 21.76
##			Mean : 20.714	Mean : 24.35
##			3rd Qu.: 40.143	3rd Qu.: 81.00
##			Max. : 71.707	Max. : 178.06
##	date	cases	type	
##	Length:116180	Min. : -10034.0	Length:116180	
##	Class :character	1st Qu.: 0.0	Class :character	
##	Mode :character	Median : 0.0	Mode :character	
##		Mean : 110.8		
##		3rd Qu.: 3.0		
##		Max. : 94305.0		

```
names(WA_global)
```

```
## [1] "Province.State" "Country.Region" "Lat"          "Long"
## [5] "date"           "cases"          "type"
```

```
str(WA_global)
```

```
## 'data.frame': 116180 obs. of 7 variables:
## $ Province.State: chr "" "" "" "" ...
## $ Country.Region: chr "Afghanistan" "Afghanistan" "Afghanistan" "Afghanistan" ...
## $ Lat : num 33 33 33 33 33 33 33 33 33 33 ...
## $ Long : num 65 65 65 65 65 65 65 65 65 65 ...
## $ date : chr "2020-01-22" "2020-01-23" "2020-01-24" "2020-01-25" ...
## $ cases : int 0 0 0 0 0 0 0 0 0 0 ...
## $ type : chr "confirmed" "confirmed" "confirmed" "confirmed" ...
```

3 Eliminate the unnecessary columns

```
WA_global <- select(WA_global, -Province.State, -Lat, -Long)
class(WA_global)
```

```
## [1] "data.frame"
```

```
head(WA_global)
```

```
## Country.Region date cases type
## 1 Afghanistan 2020-01-22 0 confirmed
## 2 Afghanistan 2020-01-23 0 confirmed
## 3 Afghanistan 2020-01-24 0 confirmed
## 4 Afghanistan 2020-01-25 0 confirmed
## 5 Afghanistan 2020-01-26 0 confirmed
## 6 Afghanistan 2020-01-27 0 confirmed
```

4 Transfor date from “Character format to date format”

```
WA_global <- rename(WA_global, country = Country.Region)
myformat <- "%Y-%m-%d"
WA_global$date <- as.Date(WA_global$date, myformat)
str(WA_global)
```

```
## 'data.frame': 116180 obs. of 4 variables:
## $ country: chr "Afghanistan" "Afghanistan" "Afghanistan" "Afghanistan" ...
## $ date : Date, format: "2020-01-22" "2020-01-23" ...
## $ cases : int 0 0 0 0 0 0 0 0 0 0 ...
## $ type : chr "confirmed" "confirmed" "confirmed" "confirmed" ...
```

5 Check if the date has changed

```
WA_global <- tbl_df(WA_global)
class(WA_global)
```

```
## [1] "tbl_df"      "tbl"        "data.frame"
```

```
str(WA_global)
```

```
## tibble [116,180 x 4] (S3: tbl_df/tbl/data.frame)
## $ country: chr [1:116180] "Afghanistan" "Afghanistan" "Afghanistan" "Afghanistan" ...
## $ date   : Date[1:116180], format: "2020-01-22" "2020-01-23" ...
## $ cases  : int [1:116180] 0 0 0 0 0 0 0 0 0 0 ...
## $ type   : chr [1:116180] "confirmed" "confirmed" "confirmed" "confirmed" ...
```

6 Include a column for totals

```
WA_global_total <- WA_global %>%
  group_by(country, type) %>%
  mutate(total_cases = cumsum(cases))
head(WA_global_total)
```

```
## # A tibble: 6 x 5
## # Groups:   country, type [1]
##   country    date    cases type    total_cases
##   <chr>      <date>    <int> <chr>      <int>
## 1 Afghanistan 2020-01-22      0 confirmed      0
## 2 Afghanistan 2020-01-23      0 confirmed      0
## 3 Afghanistan 2020-01-24      0 confirmed      0
## 4 Afghanistan 2020-01-25      0 confirmed      0
## 5 Afghanistan 2020-01-26      0 confirmed      0
## 6 Afghanistan 2020-01-27      0 confirmed      0
```

```
tail(WA_global_total)
```

```
## # A tibble: 6 x 5
## # Groups:   country, type [1]
##   country date    cases type    total_cases
##   <chr>   <date>    <int> <chr>      <int>
## 1 China   2020-06-12      0 recovered  79510
## 2 China   2020-06-13      0 recovered  79510
## 3 China   2020-06-14      0 recovered  79510
## 4 China   2020-06-15      0 recovered  79510
## 5 China   2020-06-16      0 recovered  79510
## 6 China   2020-06-17      0 recovered  79510
```

7 Select Eastern Africa countries

```
WA_countries <- WA_global_total %>%  
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea-Bissau", "Guinea",  
                        "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia", "Mauritania", "Senegal"))  
  
head(WA_countries)
```

```
## # A tibble: 6 x 5  
## # Groups:   country, type [1]  
##   country date      cases type      total_cases  
##   <chr>   <date>    <int> <chr>         <int>  
## 1 Benin  2020-01-22      0 confirmed      0  
## 2 Benin  2020-01-23      0 confirmed      0  
## 3 Benin  2020-01-24      0 confirmed      0  
## 4 Benin  2020-01-25      0 confirmed      0  
## 5 Benin  2020-01-26      0 confirmed      0  
## 6 Benin  2020-01-27      0 confirmed      0
```

```
tail(WA_countries)
```

```
## # A tibble: 6 x 5  
## # Groups:   country, type [1]  
##   country date      cases type      total_cases  
##   <chr>   <date>    <int> <chr>         <int>  
## 1 Togo   2020-06-12      8 recovered      279  
## 2 Togo   2020-06-13     12 recovered      291  
## 3 Togo   2020-06-14      0 recovered      291  
## 4 Togo   2020-06-15      8 recovered      299  
## 5 Togo   2020-06-16     45 recovered      344  
## 6 Togo   2020-06-17      9 recovered      353
```

8 Compute the infection rate

```
confirmed_cases_WA <- WA_countries %>%  
  filter(type=="confirmed") %>%  
  group_by(country, type) %>%  
  mutate(infection_rate=ifelse(country=="Ghana",  
                                total_cases*(1000000/31072940),  
                                ifelse(country=="Nigeria",  
                                          total_cases*(1000000/206139589),  
                                          ifelse(country=="Niger",  
                                                    total_cases*(1000000/24206644),  
                                                    ifelse(country=="Cabo Verde",  
                                                            total_cases*(1000000/555987),  
                                                            ifelse(country=="Guinea-Bissau",  
                                                                    total_cases*(1000000/1968001),  
                                                                    ifelse(country=="Guinea",  
                                                                              total_cases*(1000000/13132795),
```

```

      ifelse(country=="Burkina Faso",
              total_cases*(1000000/20903273),
      ifelse(country=="Togo",
              total_cases*(1000000/8278724),
      ifelse(country=="Benin",
              total_cases*(1000000/12123200),
      ifelse(country=="Gambia",
              total_cases*(1000000/2416668),
      ifelse(country=="Mauritania",
              total_cases*(1000000/4649658),
      ifelse(country=="Senegal",
              total_cases*(1000000/16743927),
      ifelse(country=="Cote d'Ivoire",
              total_cases*(1000000/26378274),
      ifelse(country=="Mali",
              total_cases*(1000000/20250833),
      ifelse(country=="Sierra Leona",
              total_cases*(1000000/7976983),
              total_cases*(1000000/5057681)))))))))
head(confirmed_cases_WA)

```

```

## # A tibble: 6 x 6
## # Groups:   country, type [1]
##   country date      cases type      total_cases infection_rate
##   <chr>   <date>    <int> <chr>          <int>         <dbl>
## 1 Benin  2020-01-22      0 confirmed          0            0
## 2 Benin  2020-01-23      0 confirmed          0            0
## 3 Benin  2020-01-24      0 confirmed          0            0
## 4 Benin  2020-01-25      0 confirmed          0            0
## 5 Benin  2020-01-26      0 confirmed          0            0
## 6 Benin  2020-01-27      0 confirmed          0            0

```

```
tail(confirmed_cases_WA)
```

```

## # A tibble: 6 x 6
## # Groups:   country, type [1]
##   country date      cases type      total_cases infection_rate
##   <chr>   <date>    <int> <chr>          <int>         <dbl>
## 1 Togo   2020-06-12      1 confirmed          525         63.4
## 2 Togo   2020-06-13      5 confirmed          530         64.0
## 3 Togo   2020-06-14      0 confirmed          530         64.0
## 4 Togo   2020-06-15      1 confirmed          531         64.1
## 5 Togo   2020-06-16      6 confirmed          537         64.9
## 6 Togo   2020-06-17      7 confirmed          544         65.7

```

```
str(confirmed_cases_WA)
```

```

## tibble [2,368 x 6] (S3: grouped_df/tbl_df/tbl/data.frame)
## $ country      : chr [1:2368] "Benin" "Benin" "Benin" "Benin" ...
## $ date         : Date[1:2368], format: "2020-01-22" "2020-01-23" ...
## $ cases        : int [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## $ type         : chr [1:2368] "confirmed" "confirmed" "confirmed" "confirmed" ...

```



```
## $ total_cases : int [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## $ infection_rate: num [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## - attr(*, "groups")= tibble [16 x 3] (S3: tbl_df/tbl/data.frame)
## ..$ country: chr [1:16] "Benin" "Burkina Faso" "Cabo Verde" "Cote d'Ivoire" ...
## ..$ type : chr [1:16] "confirmed" "confirmed" "confirmed" "confirmed" ...
## ..$ .rows :List of 16
## .. ..$ : int [1:148] 1 2 3 4 5 6 7 8 9 10 ...
## .. ..$ : int [1:148] 149 150 151 152 153 154 155 156 157 158 ...
## .. ..$ : int [1:148] 297 298 299 300 301 302 303 304 305 306 ...
## .. ..$ : int [1:148] 445 446 447 448 449 450 451 452 453 454 ...
## .. ..$ : int [1:148] 593 594 595 596 597 598 599 600 601 602 ...
## .. ..$ : int [1:148] 741 742 743 744 745 746 747 748 749 750 ...
## .. ..$ : int [1:148] 889 890 891 892 893 894 895 896 897 898 ...
## .. ..$ : int [1:148] 1037 1038 1039 1040 1041 1042 1043 1044 1045 1046 ...
## .. ..$ : int [1:148] 1185 1186 1187 1188 1189 1190 1191 1192 1193 1194 ...
## .. ..$ : int [1:148] 1333 1334 1335 1336 1337 1338 1339 1340 1341 1342 ...
## .. ..$ : int [1:148] 1481 1482 1483 1484 1485 1486 1487 1488 1489 1490 ...
## .. ..$ : int [1:148] 1629 1630 1631 1632 1633 1634 1635 1636 1637 1638 ...
## .. ..$ : int [1:148] 1777 1778 1779 1780 1781 1782 1783 1784 1785 1786 ...
## .. ..$ : int [1:148] 1925 1926 1927 1928 1929 1930 1931 1932 1933 1934 ...
## .. ..$ : int [1:148] 2073 2074 2075 2076 2077 2078 2079 2080 2081 2082 ...
## .. ..$ : int [1:148] 2221 2222 2223 2224 2225 2226 2227 2228 2229 2230 ...
## ..- attr(*, ".drop")= logi TRUE
```

```
summary(confirmed_cases_WA$infection_rate)
```

```
##      Min.   1st Qu.   Median     Mean  3rd Qu.     Max.
##  0.000   0.000    2.887   56.896   38.945 1424.494
```

```
stat.desc(confirmed_cases_WA)
```

```
##      country      date      cases type  total_cases infection_rate
## nbr.val      NA 2.368000e+03 2368.000000 NA 2.368000e+03 2.368000e+03
## nbr.null      NA 0.000000e+00 1303.000000 NA 8.470000e+02 8.470000e+02
## nbr.na        NA 0.000000e+00 0.000000 NA 0.000000e+00 0.000000e+00
## min           NA 1.828300e+04 -209.000000 NA 0.000000e+00 0.000000e+00
## max           NA 1.843000e+04 921.000000 NA 1.773500e+04 1.424494e+03
## range         NA 1.470000e+02 1130.000000 NA 1.773500e+04 1.424494e+03
## sum           NA 4.346819e+07 57656.000000 NA 1.645590e+06 1.347287e+05
## median        NA 1.835650e+04 0.000000 NA 2.250000e+01 2.887027e+00
## mean          NA 1.835650e+04 24.347973 NA 6.949282e+02 5.689556e+01
## SE.mean       NA 8.781365e-01 1.469730 NA 3.795369e+01 3.039254e+00
## CI.mean       NA 1.721997e+00 2.882091 NA 7.442593e+01 5.959876e+00
## var           NA 1.826021e+03 5115.128547 NA 3.411063e+06 2.187337e+04
## std.dev       NA 4.273197e+01 71.520127 NA 1.846906e+03 1.478965e+02
## coef.var      NA 2.327893e-03 2.937416 NA 2.657694e+00 2.599438e+00
```

9 Fatality rate

```

death_cases_WA <- WA_countries %>%
  filter(type %in% c("death", "confirmed")) %>%
  select(-total_cases) %>%
  spread(type, cases) %>%
  mutate(fatality_rate=ifelse(country=="Ghana",
    round((cumsum(death)/cumsum(confirmed))*100,digits=2),
    ifelse(country=="Nigeria",
      round((cumsum(death)/cumsum(confirmed))*100,digits=2),
      ifelse(country=="Niger",
        round((cumsum(death)/cumsum(confirmed))*100,digits=2),
        ifelse(country=="Cabo Verde",
          round((cumsum(death)/cumsum(confirmed))*100,digits=2),
          ifelse(country=="Guinea-Bissau",
            round((cumsum(death)/cumsum(confirmed))*100,digits=2),
            ifelse(country=="Guinea",
              round((cumsum(death)/cumsum(confirmed))*100,digits=2),
              ifelse(country=="Bukina Faso",
                round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                ifelse(country=="Togo",
                  round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                  ifelse(country=="Benin",
                    round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                    ifelse(country=="Gambia",
                      round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                      ifelse(country=="Mauritania",
                        round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                        ifelse(country=="Senegal",
                          round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                          ifelse(country=="Cote d'Ivoire",
                            round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                            ifelse(country=="Mali",
                              round((cumsum(death)/cumsum(confirmed))*100,digits=2),
                              ifelse(country=="Sierra Leona",
                                round((cumsum(death)/cumsum(confirmed))*100,
                                  digits=2)))))))))))))))))

head(death_cases_WA)

```

```

## # A tibble: 6 x 5
## # Groups:   country [1]
##   country date      confirmed death fatality_rate
##   <chr>   <date>         <int> <int>         <dbl>
## 1 Benin  2020-01-22          0     0           NaN
## 2 Benin  2020-01-23          0     0           NaN
## 3 Benin  2020-01-24          0     0           NaN
## 4 Benin  2020-01-25          0     0           NaN
## 5 Benin  2020-01-26          0     0           NaN
## 6 Benin  2020-01-27          0     0           NaN

```

```

tail(death_cases_WA)

```

```

## # A tibble: 6 x 5

```

```
## # Groups:   country [1]
##   country date      confirmed death fatality_rate
##   <chr>   <date>      <int> <int>      <dbl>
## 1 Togo    2020-06-12        1     0         2.48
## 2 Togo    2020-06-13        5     0         2.45
## 3 Togo    2020-06-14        0     0         2.45
## 4 Togo    2020-06-15        1     0         2.45
## 5 Togo    2020-06-16        6     0         2.42
## 6 Togo    2020-06-17        7     0         2.39
```

```
str(death_cases_WA)
```

```
## tibble [2,368 x 5] (S3: grouped_df/tbl_df/tbl/data.frame)
## $ country      : chr [1:2368] "Benin" "Benin" "Benin" "Benin" ...
## $ date         : Date[1:2368], format: "2020-01-22" "2020-01-23" ...
## $ confirmed    : int [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## $ death        : int [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## $ fatality_rate: num [1:2368] NaN NaN NaN NaN NaN NaN NaN NaN NaN ...
## - attr(*, "groups")= tibble [16 x 2] (S3: tbl_df/tbl/data.frame)
## ..$ country: chr [1:16] "Benin" "Burkina Faso" "Cabo Verde" "Cote d'Ivoire" ...
## ..$ .rows :List of 16
## .. ..$ : int [1:148] 1 2 3 4 5 6 7 8 9 10 ...
## .. ..$ : int [1:148] 149 150 151 152 153 154 155 156 157 158 ...
## .. ..$ : int [1:148] 297 298 299 300 301 302 303 304 305 306 ...
## .. ..$ : int [1:148] 445 446 447 448 449 450 451 452 453 454 ...
## .. ..$ : int [1:148] 593 594 595 596 597 598 599 600 601 602 ...
## .. ..$ : int [1:148] 741 742 743 744 745 746 747 748 749 750 ...
## .. ..$ : int [1:148] 889 890 891 892 893 894 895 896 897 898 ...
## .. ..$ : int [1:148] 1037 1038 1039 1040 1041 1042 1043 1044 1045 1046 ...
## .. ..$ : int [1:148] 1185 1186 1187 1188 1189 1190 1191 1192 1193 1194 ...
## .. ..$ : int [1:148] 1333 1334 1335 1336 1337 1338 1339 1340 1341 1342 ...
## .. ..$ : int [1:148] 1481 1482 1483 1484 1485 1486 1487 1488 1489 1490 ...
## .. ..$ : int [1:148] 1629 1630 1631 1632 1633 1634 1635 1636 1637 1638 ...
## .. ..$ : int [1:148] 1777 1778 1779 1780 1781 1782 1783 1784 1785 1786 ...
## .. ..$ : int [1:148] 1925 1926 1927 1928 1929 1930 1931 1932 1933 1934 ...
## .. ..$ : int [1:148] 2073 2074 2075 2076 2077 2078 2079 2080 2081 2082 ...
## .. ..$ : int [1:148] 2221 2222 2223 2224 2225 2226 2227 2228 2229 2230 ...
## ..- attr(*, ".drop")= logi TRUE
```

```
stat.desc(death_cases_WA)
```

```
##           country      date      confirmed      death fatality_rate
## nbr.val      NA 2.368000e+03 2368.000000 2.368000e+03 1521.000000
## nbr.null      NA 0.000000e+00 1303.000000 1.943000e+03 271.000000
## nbr.na        NA 0.000000e+00 0.000000 0.000000e+00 847.000000
## min           NA 1.828300e+04 -209.000000 0.000000e+00 0.000000
## max           NA 1.843000e+04 921.000000 3.100000e+01 50.000000
## range        NA 1.470000e+02 1130.000000 3.100000e+01 50.000000
## sum           NA 4.346819e+07 57656.000000 1.133000e+03 5882.410000
## median        NA 1.835650e+04 0.000000 0.000000e+00 2.270000
## mean          NA 1.835650e+04 24.347973 4.784628e-01 3.8674622
## SE.mean       NA 8.781365e-01 1.469730 3.407720e-02 0.1259503
## CI.mean       NA 1.721997e+00 2.882091 6.682425e-02 0.2470548
```

```
## var      NA 1.826021e+03 5115.128547 2.749853e+00 24.1283630
## std.dev  NA 4.273197e+01 71.520127 1.658268e+00 4.9120630
## coef.var NA 2.327893e-03 2.937416 3.465824e+00 1.2700998
```

10 Recovery rate

```
recovered_cases_WA <- WA_countries %>%
  filter(type %in% c("recovered", "confirmed")) %>%
  select(-total_cases) %>%
  spread(type, cases) %>%
  mutate(recovery_rate = ifelse(country == "Angola",
    round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
    ifelse(country == "Nigeria",
      round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
      ifelse(country == "Niger",
        round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
        ifelse(country == "Cabo Verde",
          round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
          ifelse(country == "Guinea-Bissau",
            round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
            ifelse(country == "Guinea",
              round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
              ifelse(country == "Bukina Faso",
                round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                ifelse(country == "Togo",
                  round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                  ifelse(country == "Benin",
                    round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                    ifelse(country == "Gambia",
                      round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                      ifelse(country == "Mauritania",
                        round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                        ifelse(country == "Senegal",
                          round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                          ifelse(country == "Cote d'Ivoire",
                            round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                            ifelse(country == "Mali",
                              round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                              ifelse(country == "Sierra Leona",
                                round((cumsum(recovered) / cumsum(confirmed)) * 100, digits = 2),
                                round((cumsum(recovered) / cumsum(confirmed)) * 100,
                                  digits = 2))))))))))))))

head(recovered_cases_WA)
```

```
## # A tibble: 6 x 5
## # Groups:   country [1]
##   country date      confirmed recovered recovery_rate
##   <chr>   <date>         <int>      <int>         <dbl>
## 1 Benin  2020-01-22           0          0           NaN
## 2 Benin  2020-01-23           0          0           NaN
```

```
## 3 Benin 2020-01-24 0 0 NaN
## 4 Benin 2020-01-25 0 0 NaN
## 5 Benin 2020-01-26 0 0 NaN
## 6 Benin 2020-01-27 0 0 NaN
```

```
tail(recovered_cases_WA)
```

```
## # A tibble: 6 x 5
## # Groups:   country [1]
##   country date      confirmed recovered recovery_rate
##   <chr>   <date>         <int>      <int>         <dbl>
## 1 Togo   2020-06-12          1          8          53.1
## 2 Togo   2020-06-13          5         12          54.9
## 3 Togo   2020-06-14          0          0          54.9
## 4 Togo   2020-06-15          1          8          56.3
## 5 Togo   2020-06-16          6         45          64.1
## 6 Togo   2020-06-17          7          9          64.9
```

```
str(recovered_cases_WA)
```

```
## tibble [2,368 x 5] (S3: grouped_df/tbl_df/tbl/data.frame)
## $ country      : chr [1:2368] "Benin" "Benin" "Benin" "Benin" ...
## $ date         : Date[1:2368], format: "2020-01-22" "2020-01-23" ...
## $ confirmed    : int [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## $ recovered    : int [1:2368] 0 0 0 0 0 0 0 0 0 0 ...
## $ recovery_rate: num [1:2368] NaN NaN NaN NaN NaN NaN NaN NaN NaN ...
## - attr(*, "groups")= tibble [16 x 2] (S3: tbl_df/tbl/data.frame)
## ..$ country: chr [1:16] "Benin" "Burkina Faso" "Cabo Verde" "Cote d'Ivoire" ...
## ..$ .rows :List of 16
## .. ..$ : int [1:148] 1 2 3 4 5 6 7 8 9 10 ...
## .. ..$ : int [1:148] 149 150 151 152 153 154 155 156 157 158 ...
## .. ..$ : int [1:148] 297 298 299 300 301 302 303 304 305 306 ...
## .. ..$ : int [1:148] 445 446 447 448 449 450 451 452 453 454 ...
## .. ..$ : int [1:148] 593 594 595 596 597 598 599 600 601 602 ...
## .. ..$ : int [1:148] 741 742 743 744 745 746 747 748 749 750 ...
## .. ..$ : int [1:148] 889 890 891 892 893 894 895 896 897 898 ...
## .. ..$ : int [1:148] 1037 1038 1039 1040 1041 1042 1043 1044 1045 1046 ...
## .. ..$ : int [1:148] 1185 1186 1187 1188 1189 1190 1191 1192 1193 1194 ...
## .. ..$ : int [1:148] 1333 1334 1335 1336 1337 1338 1339 1340 1341 1342 ...
## .. ..$ : int [1:148] 1481 1482 1483 1484 1485 1486 1487 1488 1489 1490 ...
## .. ..$ : int [1:148] 1629 1630 1631 1632 1633 1634 1635 1636 1637 1638 ...
## .. ..$ : int [1:148] 1777 1778 1779 1780 1781 1782 1783 1784 1785 1786 ...
## .. ..$ : int [1:148] 1925 1926 1927 1928 1929 1930 1931 1932 1933 1934 ...
## .. ..$ : int [1:148] 2073 2074 2075 2076 2077 2078 2079 2080 2081 2082 ...
## .. ..$ : int [1:148] 2221 2222 2223 2224 2225 2226 2227 2228 2229 2230 ...
## ..- attr(*, ".drop")= logi TRUE
```

```
stat.desc(recovered_cases_WA)
```

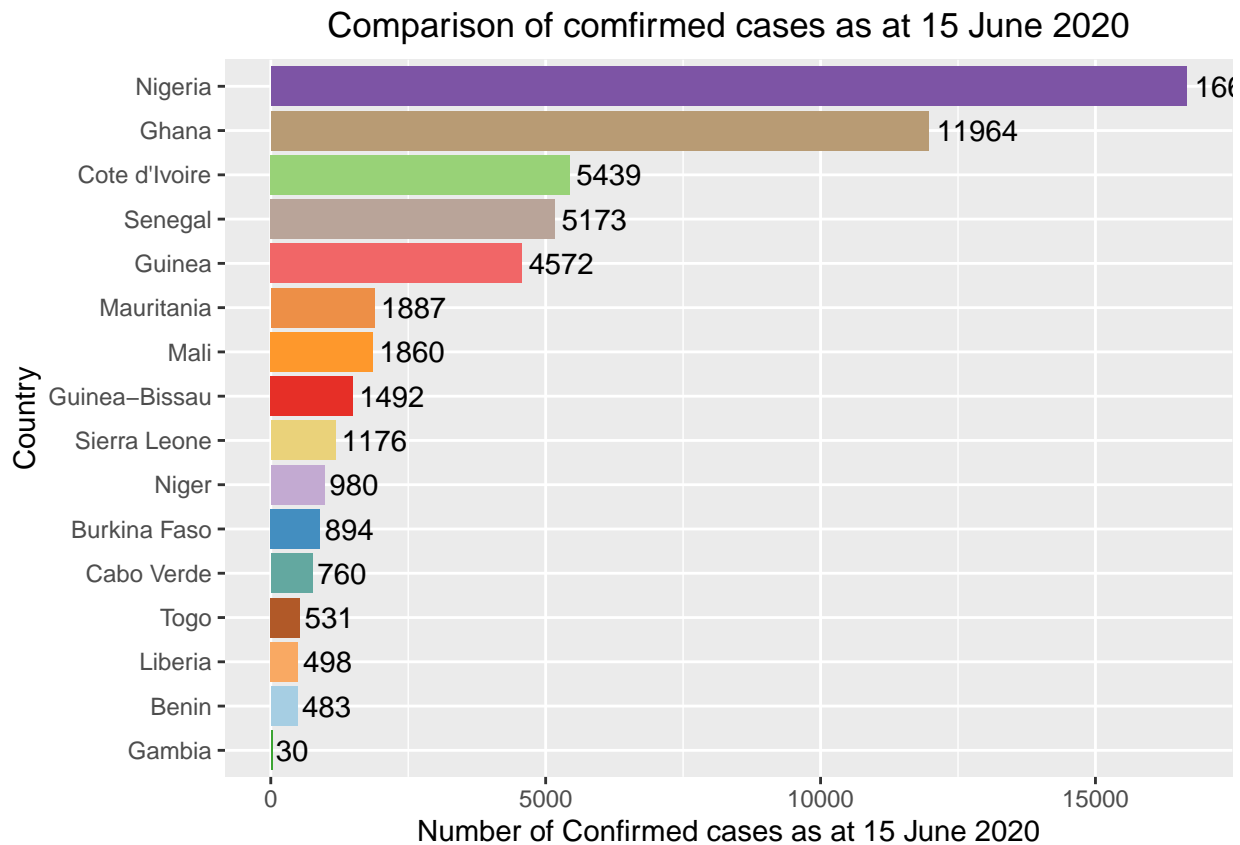
```
##           country      date      confirmed      recovered recovery_rate
## nbr.val      NA 2.368000e+03 2368.000000 2368.000000 1.521000e+03
## nbr.null      NA 0.000000e+00 1303.000000 1572.000000 2.400000e+02
```

```
## nbr.na      NA 0.000000e+00      0.000000      0.000000      8.470000e+02
## min        NA 1.828300e+04     -209.000000     -31.000000      0.000000e+00
## max        NA 1.843000e+04      921.000000      786.000000      9.031000e+01
## range      NA 1.470000e+02     1130.000000      817.000000      9.031000e+01
## sum        NA 4.346819e+07    57656.000000    25484.000000      4.829217e+04
## median     NA 1.835650e+04      0.000000      0.000000      2.879000e+01
## mean       NA 1.835650e+04      24.347973      10.7618243      3.175028e+01
## SE.mean    NA 8.781365e-01      1.469730      0.7331091      6.705149e-01
## CI.mean    NA 1.721997e+00      2.882091      1.4376026      1.315232e+00
## var        NA 1.826021e+03     5115.128547    1272.6792011      6.838267e+02
## std.dev    NA 4.273197e+01      71.520127      35.6746297      2.615008e+01
## coef.var   NA 2.327893e-03      2.937416      3.3149240      8.236174e-01
```

11 Plot a bar chart

```
nb.colors <- 16
mycolors <- colorRampPalette(brewer.pal(12, "Paired"))(nb.colors)

WA_countries %>%
  filter(country %in% c("Ghana","Nigeria","Niger","Guinea-Bissau","Guinea",
                        "Cabo Verde","Burkina Faso", "Togo", "Benin","Gambia",
                        "Mauritania","Senegal","Cote d'Ivoire",
                        "Sierra Leone","Mali","Liberia"), type=="confirmed", date=="2020-06-15" ) %>%
  ggplot( aes(country, total_cases, fill=country)) +
  geom_bar(aes(reorder(country, total_cases),total_cases),
           stat= "identity", show.legend = FALSE) +
  geom_text(aes(label= total_cases), vjust=0.5, hjust=-0.1, colour="black") +
  scale_fill_manual(values = mycolors) +
  coord_flip() +
  ggtitle("Comparison of confirmed cases as at 15 June 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  xlab("Country")+
  ylab("Number of Confirmed cases as at 15 June 2020")
```



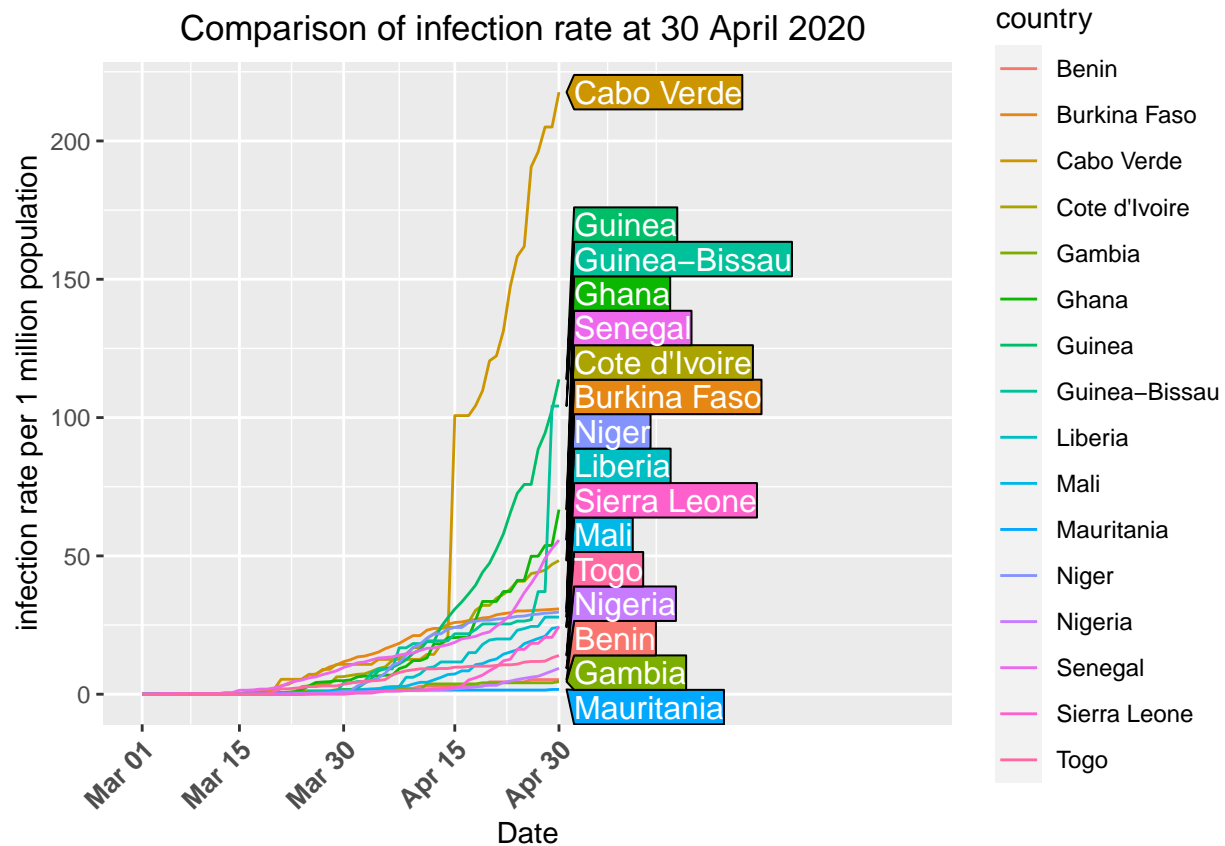
```
ggsave("confirmed_WA1.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

12 Plot a line graph as at 30 April

```
confirmed_cases_WA %>%
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea", "Guinea-Bissau",
                        "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia",
                        "Mauritania", "Senegal", "Cote d'Ivoire",
                        "Sierra Leone", "Mali", "Liberia"), date < "2020-05-01") %>%
  ggplot(aes(x = date, y = infection_rate, group = country, color = country)) +
  geom_line() +
  geom_dl(aes(label = country),
          method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comparison of infection rate at 30 April 2020 ") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("infection rate per 1 million population") +
  xlab("Date") +
  scale_x_date(limits = as.Date(c("2020-03-01", "2020-06-20")),
               date_labels = ("%b %d"),
               breaks = as.Date(c("2020-03-01", "2020-03-15", "2020-03-30",
                                   "2020-04-15", "2020-04-30")))) +
```

```
theme(axis.text.x = element_text(angle = 45, vjust = 1, hjust = 1,
size = 10, face = "bold"))
```

```
## Warning: Removed 624 row(s) containing missing values (geom_path).
```



```
ggsave("confirmed_WA2.png", #other supported files;- "eps", "ps", "tex"
width =30, height = 15,
units = "cm", # other options c("in", "cm", "mm")
dpi = 70)
```

```
## Warning: Removed 624 row(s) containing missing values (geom_path).
```

13 Plot a line graph as at 31 May

```
confirmed_cases_WA %>%
  filter(country %in% c("Ghana","Nigeria","Niger","Guinea","Guinea-Bissau",
    "Cabo Verde","Burkina Faso", "Togo", "Benin","Gambia",
    "Mauritania","Senegal","Cote d'Ivoire",
    "Sierra Leone","Mali","Liberia"),date<"2020-06-01") %>%
  ggplot( aes(x=date, y=infection_rate, group=country, color=country)) +
  geom_line() +
```

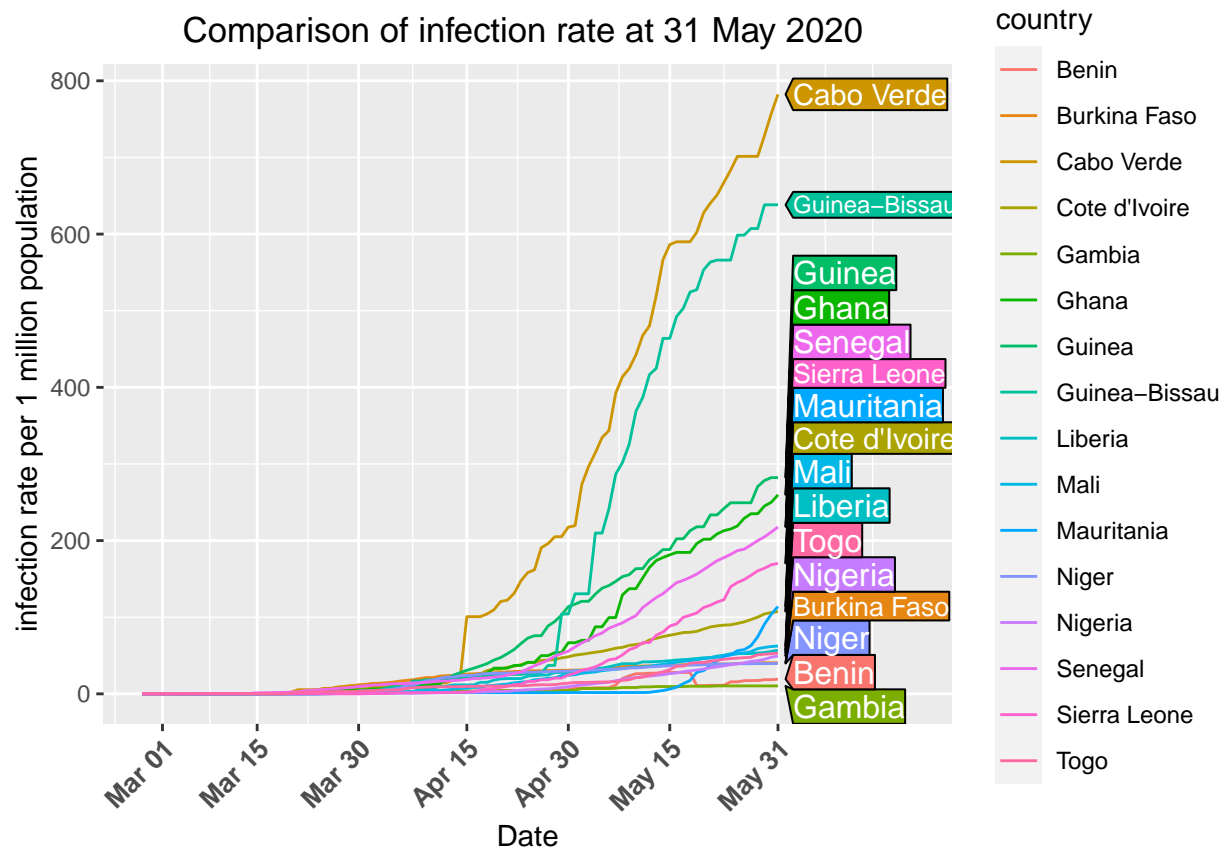


```

geom_dl(aes(label = country),
        method = list(dl.trans(x = x + 0.1), "last.polygons")) +
scale_fill_manual(values = mycolors) +
ggtitle("Comparison of infection rate at 31 May 2020 ") +
theme(plot.title = element_text(hjust = 0.5)) +
ylab("infection rate per 1 million population")+
xlab("Date") +
scale_x_date(limits = as.Date(c("2020-02-27","2020-06-20")),
             date_labels = ("%b %d"),
             breaks = as.Date(c("2020-02-15","2020-03-01","2020-03-15","2020-03-30",
                                "2020-04-15","2020-04-30","2020-05-15",
                                "2020-05-31")))) +
theme(axis.text.x = element_text(angle = 45, vjust = 1, hjust = 1,
                                  size = 10, face = "bold"))

```

Warning: Removed 576 row(s) containing missing values (geom_path).



```

ggsave("confirmed_WA3.png", #other supported files;- "eps", "ps", "tex"
width =30, height = 15,
units = "cm", # other options c("in", "cm", "mm")
dpi = 70)

```

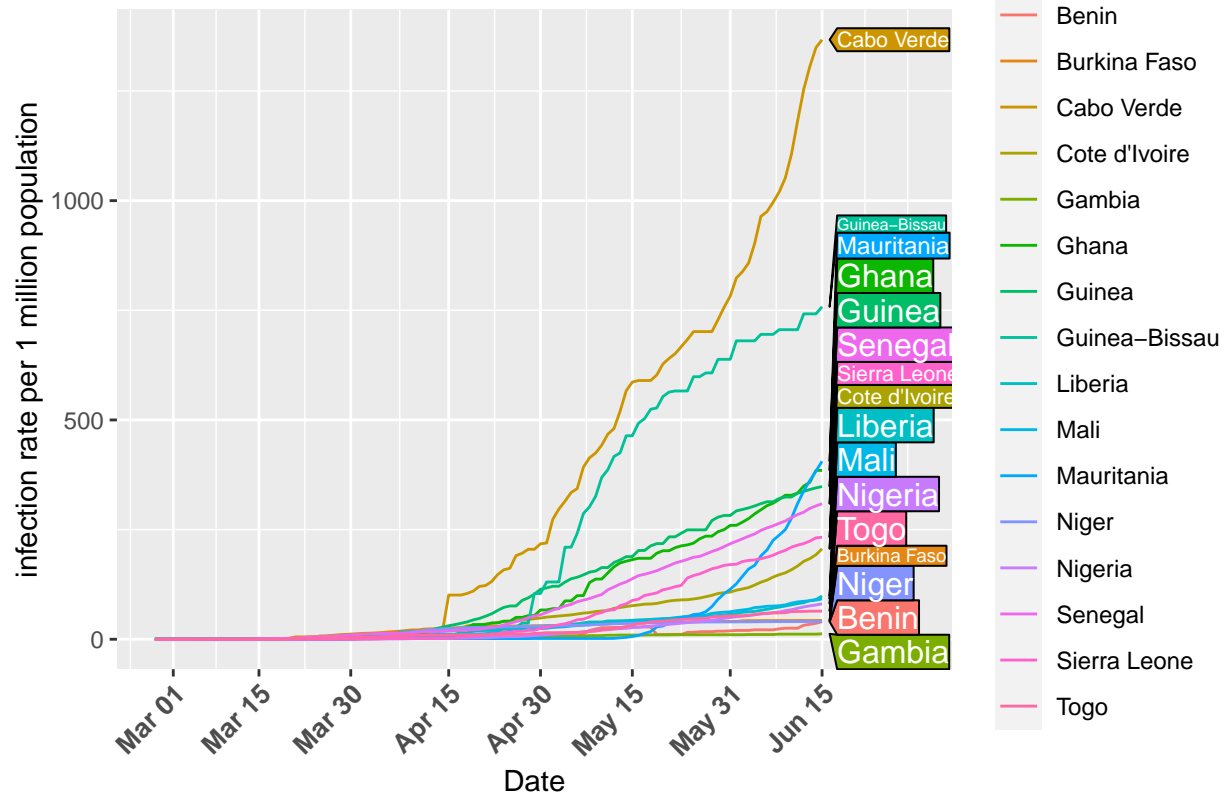
Warning: Removed 576 row(s) containing missing values (geom_path).

14 Plot a line graph as at 15 June

```
confirmed_cases_WA %>%
  filter(country %in% c("Ghana","Nigeria","Niger","Guinea","Guinea-Bissau",
    "Cabo Verde","Burkina Faso", "Togo", "Benin","Gambia",
    "Mauritania","Senegal","Cote d'Ivoire",
    "Sierra Leone","Mali","Liberia"),date<"2020-06-16") %>%
  ggplot( aes(x=date, y=infection_rate, group=country, color=country)) +
  geom_line() +
  geom_dl(aes(label = country),
    method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comparison of infection rate at 15 June 2020 ") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("infection rate per 1 million population")+
  xlab("Date") +
  scale_x_date(limits = as.Date(c("2020-02-27","2020-06-30")),
    date_labels = ("%b %d"),
    breaks = as.Date(c("2020-02-15","2020-03-01","2020-03-15","2020-03-30",
      "2020-04-15","2020-04-30","2020-05-15",
      "2020-05-31","2020-06-15")))) +
  theme(axis.text.x = element_text(angle = 45, vjust = 1, hjust = 1,
    size = 10, face = "bold"))
```

```
## Warning: Removed 576 row(s) containing missing values (geom_path).
```

Comparison of infection rate at 15 June 2020



```
ggsave("confirmed_WA4.png", #other supported files;- "eps", "ps", "tex"
width =30, height = 15,
units = "cm", # other options c("in", "cm", "mm")
dpi = 70)
```

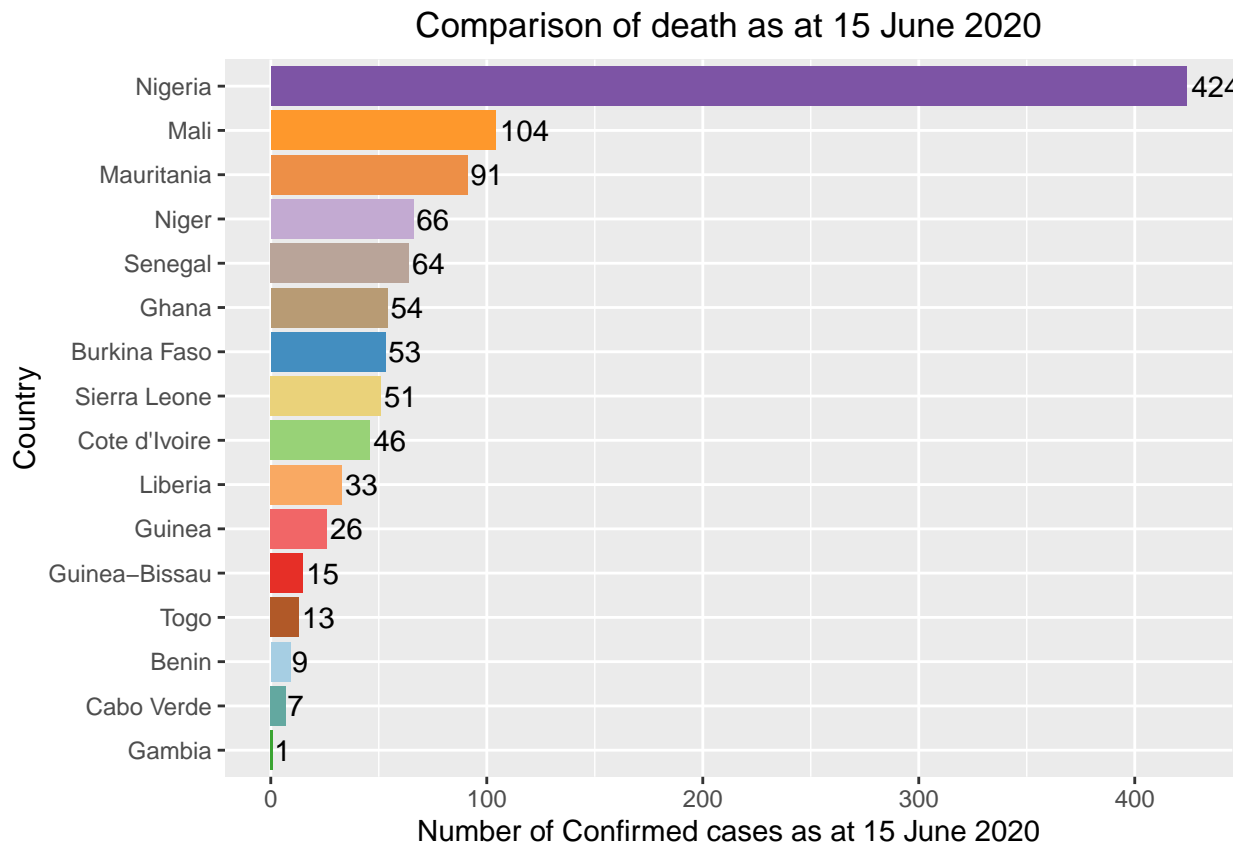
```
## Warning: Removed 576 row(s) containing missing values (geom_path).
```

15 Plot a bar graph for the deaths

```
WA_countries %>%
  filter(country %in% c("Ghana","Nigeria","Niger","Guinea-Bissau","Guinea",
    "Cabo Verde","Burkina Faso", "Togo", "Benin","Gambia",
    "Mauritania","Senegal","Cote d'Ivoire",
    "Sierra Leone","Mali","Liberia"), type=="death", date=="2020-06-15" ) %>%

  ggplot( aes(country, total_cases, fill=country)) +
  geom_bar(aes(reorder(country, total_cases),total_cases),
    stat= "identity", show.legend = FALSE) +
  geom_text(aes(label= total_cases), vjust=0.5, hjust=-0.1, colour="black") +
  scale_fill_manual(values = mycolors) +
  coord_flip() +
  ggtitle("Comparison of death as at 15 June 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
```

```
xlab("Country")+
ylab("Number of Confirmed cases as at 15 June 2020")
```



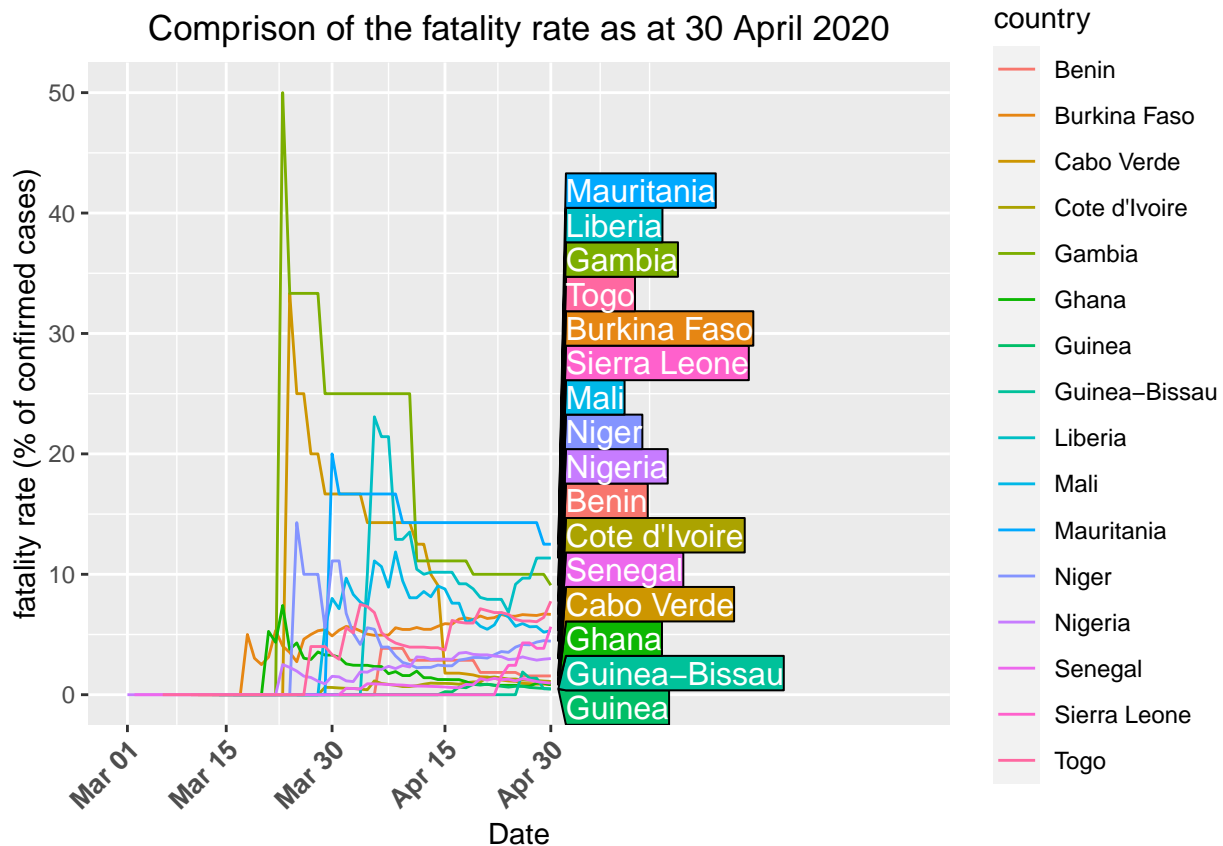
```
ggsave("death_WA1.png",
width =30, height = 15, units = "cm", dpi = 70)
```

16 Plot line graph for fatality rate as at 30 April

```
death_cases_WA %>%
  filter(country %in% c("Ghana","Nigeria","Niger","Guinea-Bissau","Guinea",
    "Cabo Verde","Burkina Faso", "Togo", "Benin","Gambia",
    "Mauritania","Senegal","Cote d'Ivoire",
    "Sierra Leone","Mali","Liberia"),date<"2020-05-01") %>%
  ggplot( aes(x=date, y=fatality_rate, group=country, color=country)) +
  geom_line() +
  geom_dl(aes(label = country),
    method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comprison of the fatality rate as at 30 April 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("fatality rate (% of confirmed cases)") +
  xlab("Date") +
```

```
scale_y_continuous(limits = c(ymin= 0,
                              ymax= max(death_cases_WA$fatality_rate)))+
scale_x_date(limits = as.Date(c("2020-03-01", "2020-06-20")),
             date_labels = ("%b %d"),
             breaks = as.Date(c("2020-03-01", "2020-03-15", "2020-03-30",
                                "2020-04-15", "2020-04-30")))+
theme(axis.text.x = element_text(angle = 45, vjust = 1,
                                  hjust = 1, size = 10, face = "bold"))
```

Warning: Removed 849 row(s) containing missing values (geom_path).



```
ggsave("death_WA2.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

Warning: Removed 849 row(s) containing missing values (geom_path).

17 Plot line graph for fatality rate as at 31 May

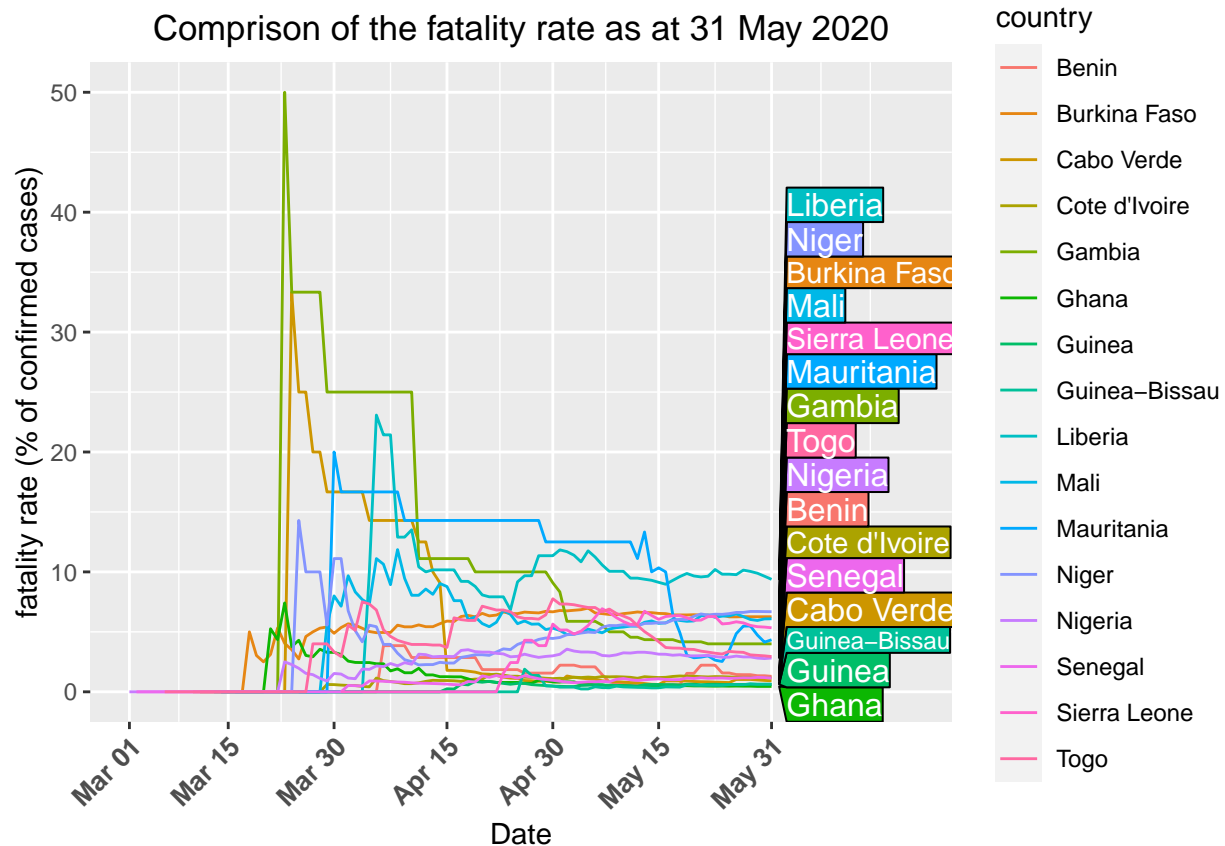
```
death_cases_WA %>%
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea-Bissau", "Guinea",
                        "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia",
```

```

      "Mauritania","Senegal","Cote d'Ivoire",
      "Sierra Leone","Mali","Liberia"),date<"2020-06-01") %>%
ggplot( aes(x=date, y=fatality_rate, group=country, color=country)) +
  geom_line() +
  geom_dl(aes(label = country),
    method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comprison of the fatality rate as at 31 May 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("fatality rate (% of confirmed cases)") +
  xlab("Date") +
  scale_y_continuous(limits = c(ymin= 0,
                                ymax= max(death_cases_WA$fatality_rate))) +
  scale_x_date(limits = as.Date(c("2020-03-01","2020-06-20")),
    date_labels = ("%b %d"),
    breaks = as.Date(c("2020-03-01","2020-03-15","2020-03-30",
                          "2020-04-15","2020-04-30","2020-05-15",
                          "2020-05-31")))) +
  theme(axis.text.x = element_text(angle = 45, vjust = 1,
                                    hjust = 1, size = 10, face = "bold"))

```

Warning: Removed 849 row(s) containing missing values (geom_path).



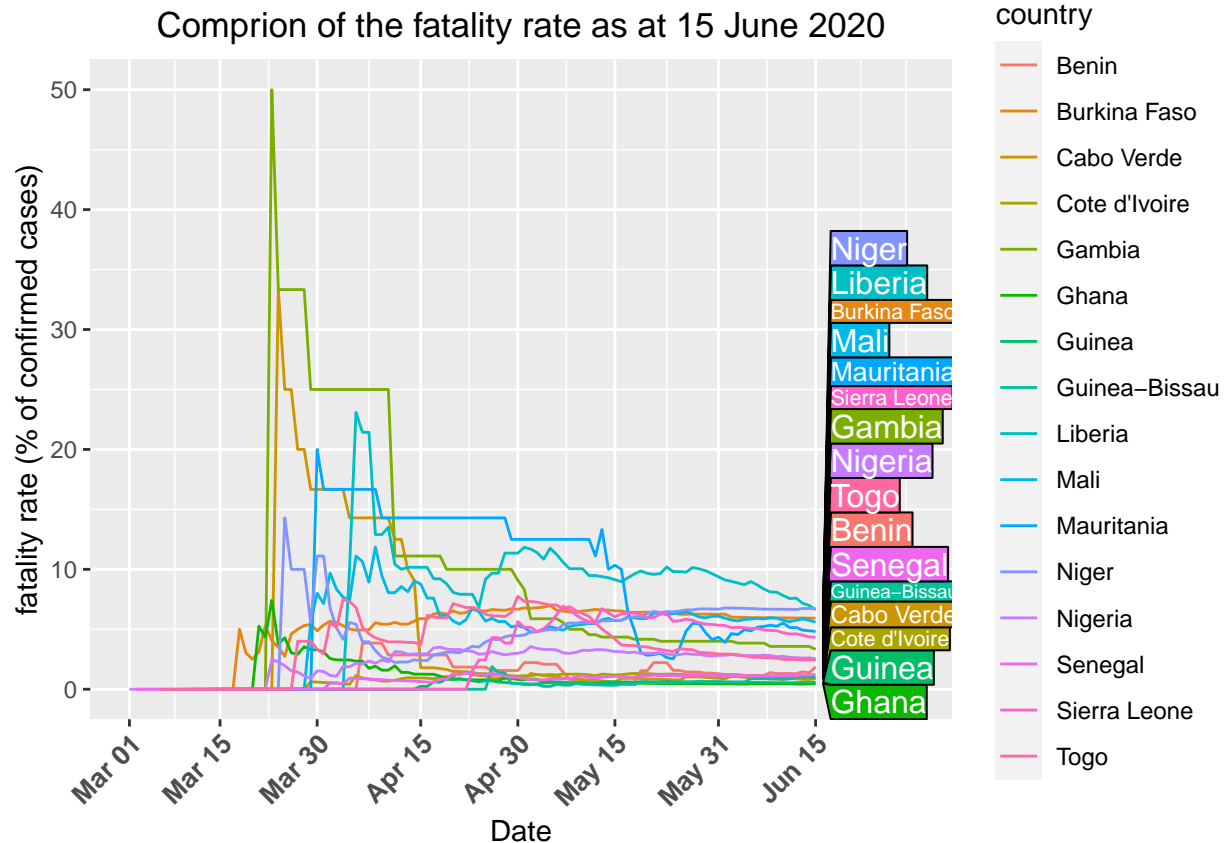
```
ggsave("death_WA3.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

```
## Warning: Removed 849 row(s) containing missing values (geom_path).
```

18 Plot line graph for fatality rate as at 15 June

```
death_cases_WA %>%
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea-Bissau", "Guinea",
                        "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia",
                        "Mauritania", "Senegal", "Cote d'Ivoire",
                        "Sierra Leone", "Mali", "Liberia"), date < "2020-06-16") %>%
  ggplot(aes(x = date, y = fatality_rate, group = country, color = country)) +
  geom_line() +
  geom_dl(aes(label = country),
          method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comprion of the fatality rate as at 15 June 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("fatality rate (% of confirmed cases)") +
  xlab("Date") +
  scale_y_continuous(limits = c(ymin = 0,
                                ymax = max(death_cases_WA$fatality_rate))) +
  scale_x_date(limits = as.Date(c("2020-03-01", "2020-06-30")),
               date_labels = ("%b %d"),
               breaks = as.Date(c("2020-03-01", "2020-03-15", "2020-03-30",
                                   "2020-04-15", "2020-04-30", "2020-05-15",
                                   "2020-05-31", "2020-06-15")))) +
  theme(axis.text.x = element_text(angle = 45, vjust = 1,
                                    hjust = 1, size = 10, face = "bold"))
```

```
## Warning: Removed 849 row(s) containing missing values (geom_path).
```



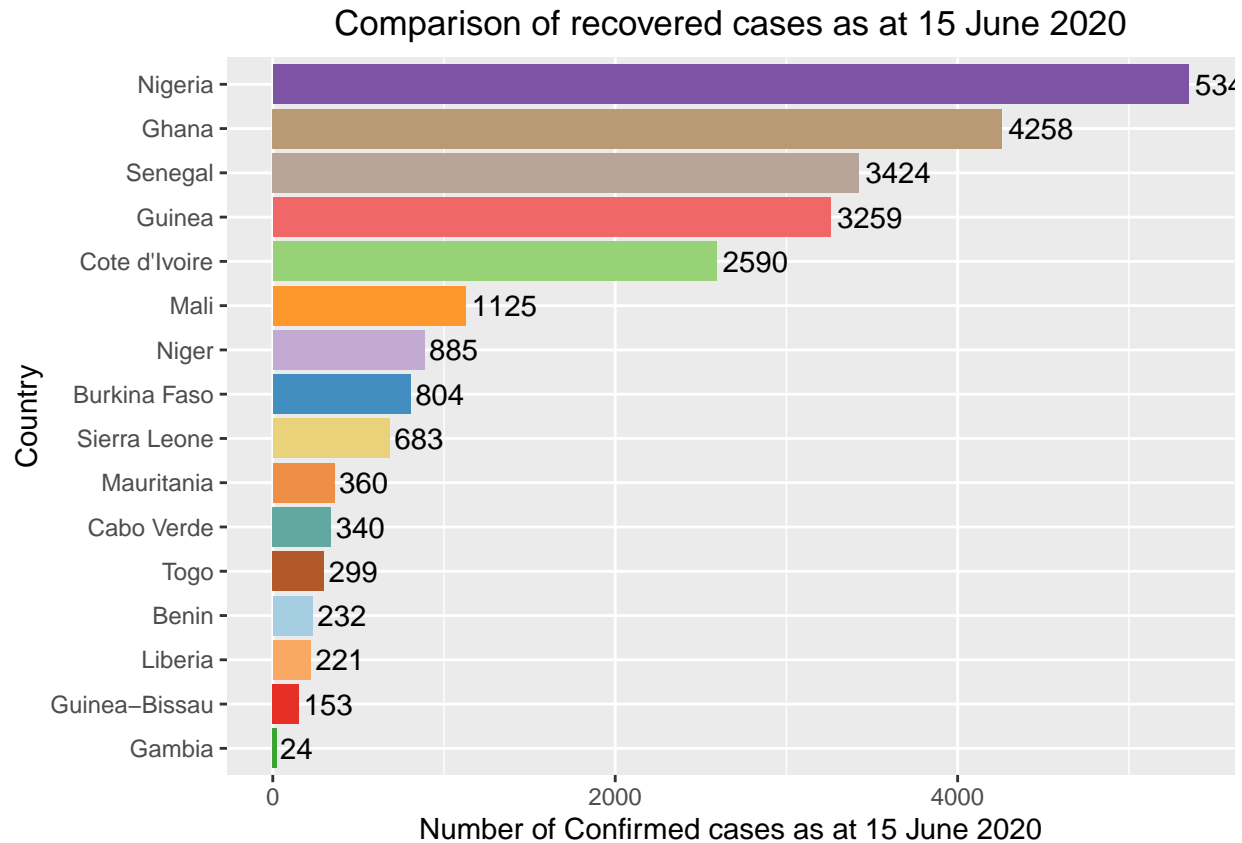
```
ggsave("death_WA4.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

```
## Warning: Removed 849 row(s) containing missing values (geom_path).
```

19 Plot the bar chart for recoveries

```
WA_countries %>%
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea-Bissau", "Guinea",
                       "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia",
                       "Mauritania", "Senegal", "Cote d'Ivoire",
                       "Sierra Leone", "Mali", "Liberia"), type == "recovered", date == "2020-06-15") %>%

  ggplot(aes(country, total_cases, fill = country)) +
  geom_bar(aes(reorder(country, total_cases), total_cases),
          stat = "identity", show.legend = FALSE) +
  geom_text(aes(label = total_cases), vjust = 0.5, hjust = -0.1, colour = "black") +
  scale_fill_manual(values = mycolors) +
  coord_flip() +
  ggtitle("Comparison of recovered cases as at 15 June 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  xlab("Country") +
  ylab("Number of Confirmed cases as at 15 June 2020")
```

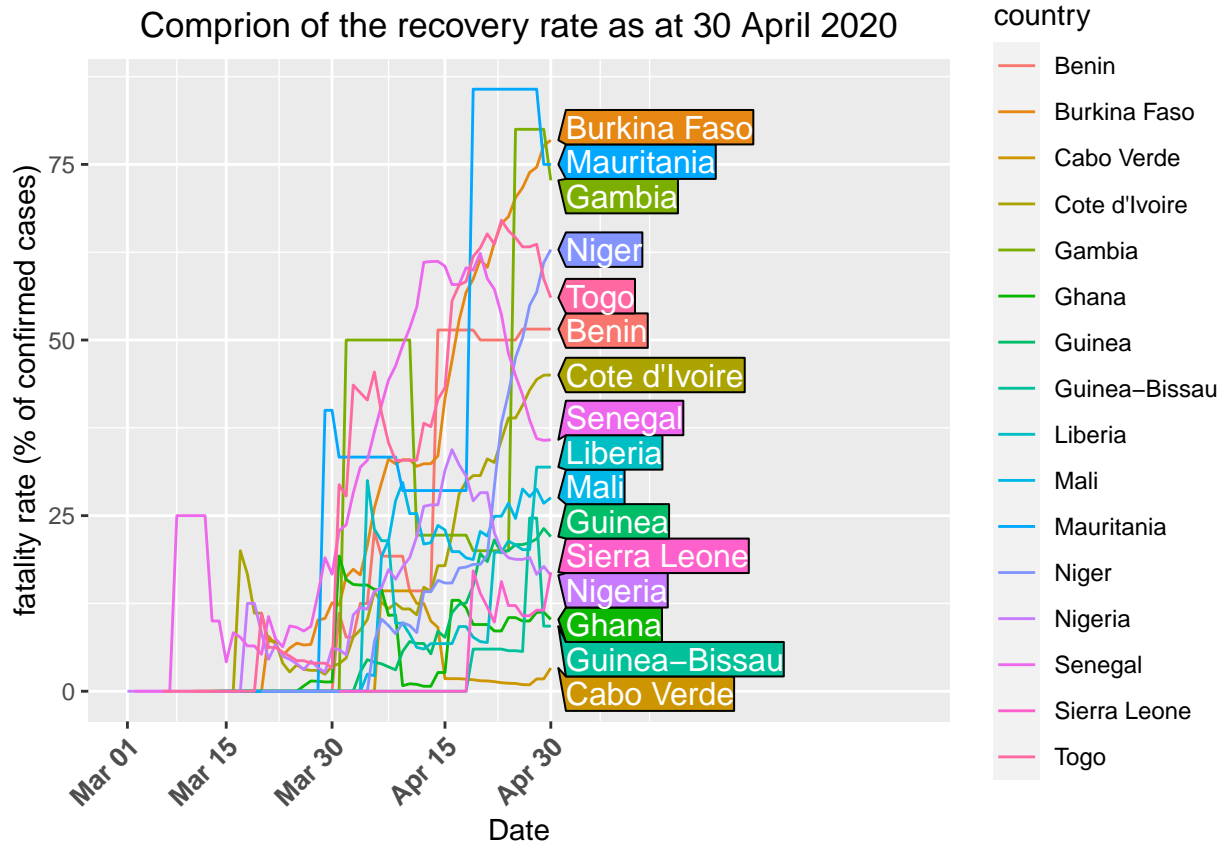
```
ggsave("recovered_WA1.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

20 Plot a line graph for recovery rate as at 30 April

```
recovered_cases_WA %>%
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea-Bissau", "Guinea",
                        "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia",
                        "Mauritania", "Senegal", "Cote d'Ivoire",
                        "Sierra Leone", "Mali", "Liberia"), date < "2020-05-01") %>%
  ggplot(aes(x = date, y = recovery_rate, group = country, color = country)) +
  geom_line() +
  geom_dl(aes(label = country),
          method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comprion of the recovery rate as at 30 April 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("fatality rate (% of confirmed cases)") +
  xlab("Date") +
  scale_y_continuous(limits = c(ymin = 0,
                                ymax = max(recovered_cases_WA$recovery_rate))) +
  scale_x_date(limits = as.Date(c("2020-03-01", "2020-06-20")),
               date_labels = ("%b %d"),
```

```
breaks = as.Date(c("2020-03-01", "2020-03-15", "2020-03-30",
                  "2020-04-15", "2020-04-30")) +
theme(axis.text.x = element_text(angle = 45, vjust = 1,
                                  hjust = 1, size = 10, face = "bold"))
```

Warning: Removed 849 row(s) containing missing values (geom_path).



```
ggsave("recovered_WA2.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

Warning: Removed 849 row(s) containing missing values (geom_path).

21 Plot a line graph for recovery rate as at 31 May

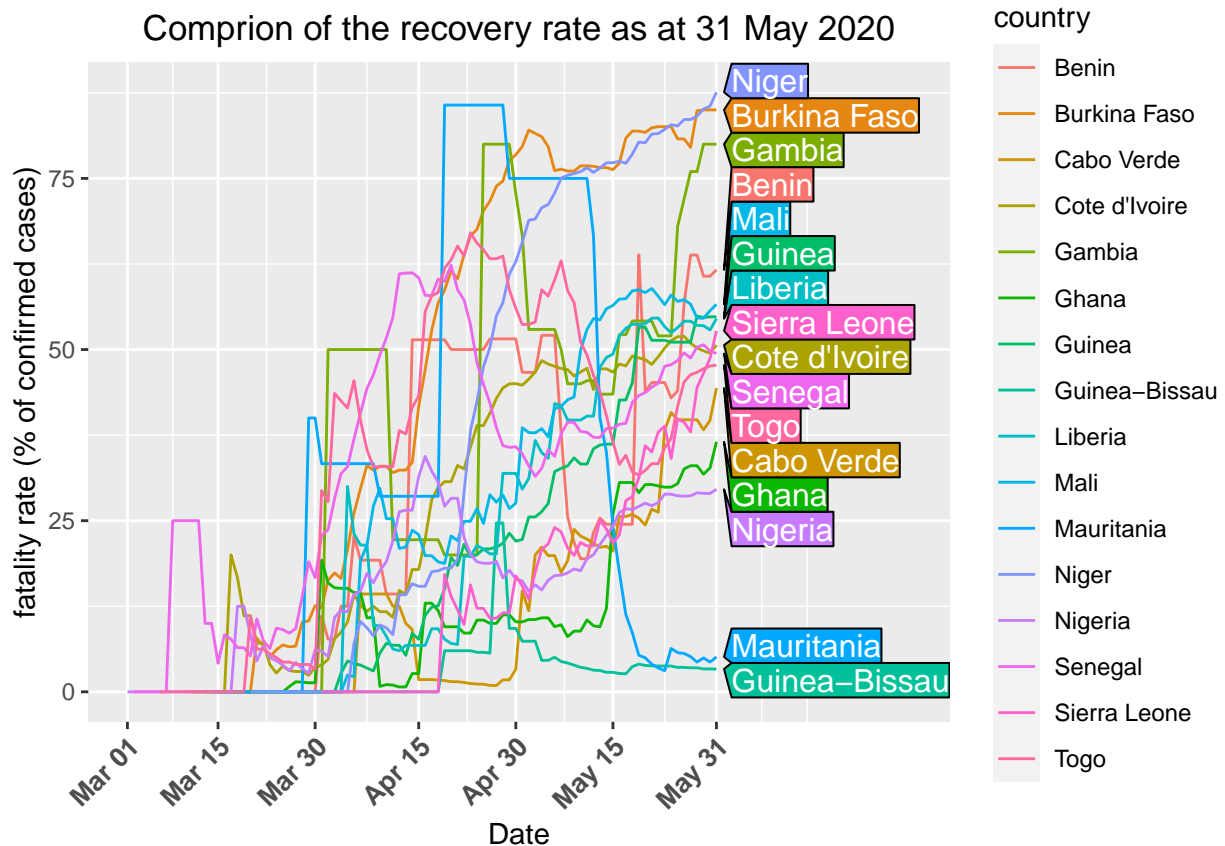
```
recovered_cases_WA %>%
  filter(country %in% c("Ghana", "Nigeria", "Niger", "Guinea-Bissau", "Guinea",
                       "Cabo Verde", "Burkina Faso", "Togo", "Benin", "Gambia",
                       "Mauritania", "Senegal", "Cote d'Ivoire",
                       "Sierra Leone", "Mali", "Liberia"), date < "2020-06-01") %>%
  ggplot(aes(x=date, y=recovery_rate, group=country, color=country)) +
  geom_line() +
```

```

geom_dl(aes(label = country),
        method = list(dl.trans(x = x + 0.1), "last.polygons")) +
scale_fill_manual(values = mycolors) +
ggtitle("Comprion of the recovery rate as at 31 May 2020") +
theme(plot.title = element_text(hjust = 0.5)) +
ylab("fatality rate (% of confirmed cases)") +
xlab("Date") +
scale_y_continuous(limits = c(ymin= 0,
                              ymax= max(recovered_cases_WA$recovery_rate)))+
scale_x_date(limits = as.Date(c("2020-03-01", "2020-06-30")),
             date_labels = ("%b %d"),
             breaks = as.Date(c("2020-03-01", "2020-03-15", "2020-03-30",
                                "2020-04-15", "2020-04-30", "2020-05-15",
                                "2020-05-31")))) +
theme(axis.text.x = element_text(angle = 45, vjust = 1,
                                hjust = 1, size = 10, face = "bold"))

```

Warning: Removed 849 row(s) containing missing values (geom_path).



```

ggsave("recovered_WA3.png",
       width = 30, height = 15, units = "cm", dpi = 70)

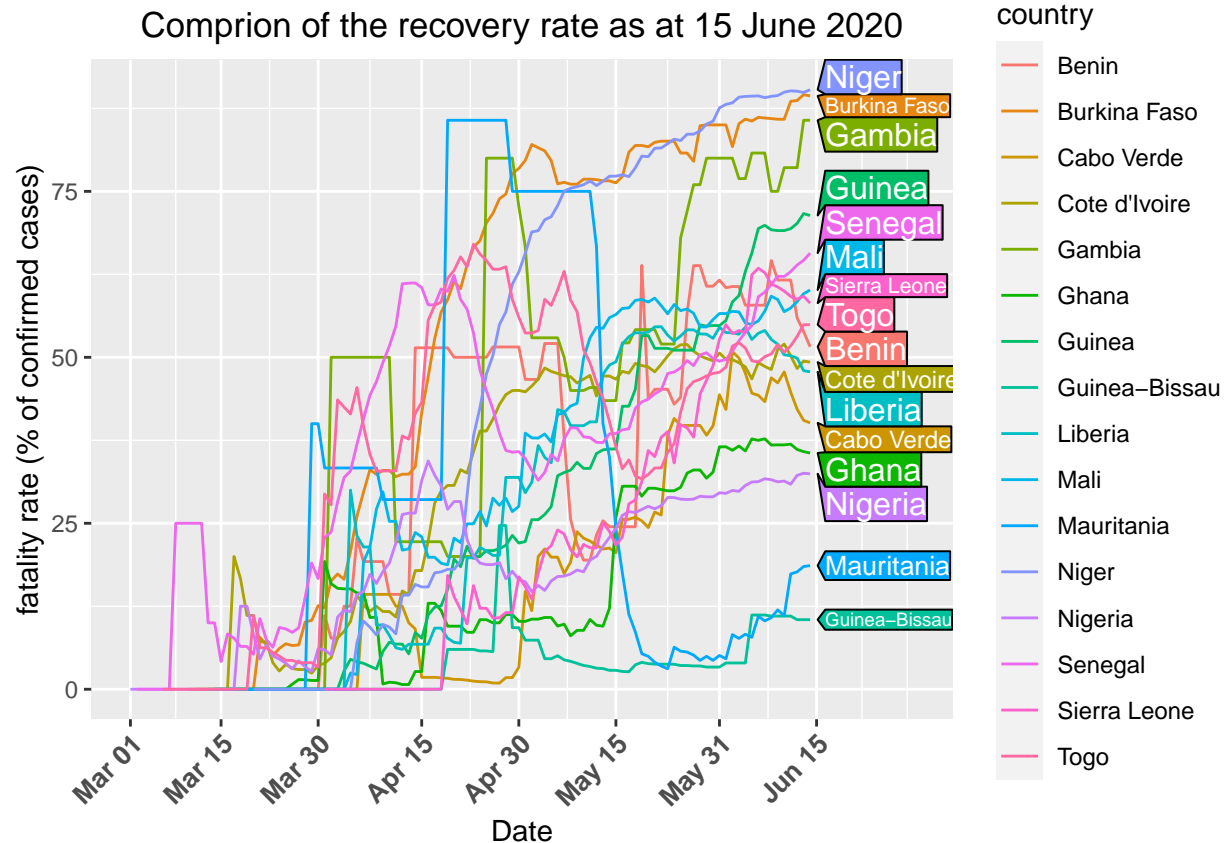
```

Warning: Removed 849 row(s) containing missing values (geom_path).

22 Plot a line graph for recovery rate as at 15 June

```
recovered_cases_WA %>%
  filter(country %in% c("Ghana","Nigeria","Niger","Guinea-Bissau","Guinea",
                        "Cabo Verde","Burkina Faso", "Togo", "Benin","Gambia",
                        "Mauritania","Senegal","Cote d'Ivoire",
                        "Sierra Leone","Mali","Liberia"),date<"2020-06-15") %>%
  ggplot( aes(x=date, y=recovery_rate, group=country, color=country)) +
  geom_line() +
  geom_dl(aes(label = country),
          method = list(dl.trans(x = x + 0.1), "last.polygons")) +
  scale_fill_manual(values = mycolors) +
  ggtitle("Comprion of the recovery rate as at 15 June 2020") +
  theme(plot.title = element_text(hjust = 0.5)) +
  ylab("fatality rate (% of confirmed cases)") +
  xlab("Date") +
  scale_y_continuous(limits = c(ymin= 0,
                                ymax= max(recovered_cases_WA$recovery_rate)))+
  scale_x_date(limits = as.Date(c("2020-03-01","2020-06-30")),
              date_labels = ("%b %d"),
              breaks = as.Date(c("2020-03-01","2020-03-15","2020-03-30",
                                  "2020-04-15","2020-04-30","2020-05-15",
                                  "2020-05-31","2020-06-15")))) +
  theme(axis.text.x = element_text(angle = 45, vjust = 1,
                                    hjust = 1, size = 10, face = "bold"))
```

```
## Warning: Removed 849 row(s) containing missing values (geom_path).
```



```
ggsave("recovered_WA4.png",
       width = 30, height = 15, units = "cm", dpi = 70)
```

```
## Warning: Removed 849 row(s) containing missing values (geom_path).
```

```
writexl::write_xlsx(x = confirmed_cases_WA, path = "C:/Users/uganda/Documents/COVID-19/COVID-19_Data/confirmed_cases_WA.xlsx")
write.csv(confirmed_cases_WA, "C:/Users/uganda/Documents/COVID-19/COVID-19_Data/confirmed_cases_WA.csv")
writexl::write_xlsx(x = recovered_cases_WA, path = "C:/Users/uganda/Documents/COVID-19/COVID-19_Data/recovered_cases_WA.xlsx")
write.csv(recovered_cases_WA, "C:/Users/uganda/Documents/COVID-19/COVID-19_Data/recovered_cases_WA.csv")
writexl::write_xlsx(x = death_cases_WA, path = "C:/Users/uganda/Documents/COVID-19/COVID-19_Data/death_cases_WA.xlsx",
                  col_names = TRUE)
write.csv(death_cases_WA, "C:/Users/uganda/Documents/COVID-19/COVID-19_Data/death_cases_WA.csv",
          row.names = FALSE)
```