

# weather

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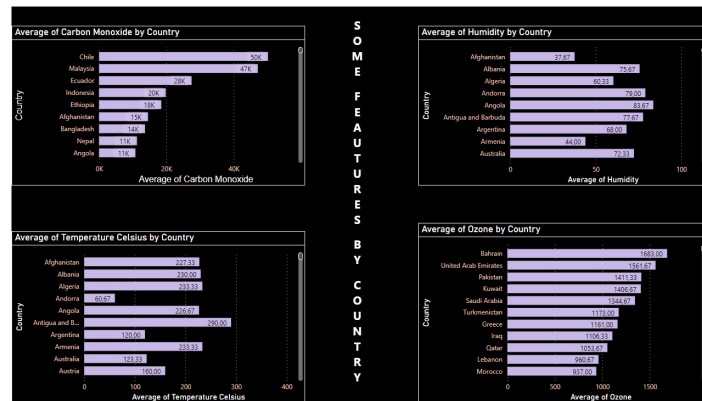
## WEATHER DATA SET



([https://www.yandex.com.tr/gorsel/search?from=tabbar&img\\_url=https%3A%2F%2Fcatherineasquithgallery.com%2Fuploads%2Fposts%2F2021-02%2F1613686171\\_41-p-for-dlya-prezentatsii-pogoda-43.png&lr=104782&pos=18&rt=simage&text=weather](https://www.yandex.com.tr/gorsel/search?from=tabbar&img_url=https%3A%2F%2Fcatherineasquithgallery.com%2Fuploads%2Fposts%2F2021-02%2F1613686171_41-p-for-dlya-prezentatsii-pogoda-43.png&lr=104782&pos=18&rt=simage&text=weather))

This data set was taken from Kaggle (<https://www.kaggle.com/datasets/nelgiryewithana/global-weather-repository?select=GlobalWeatherRepository.csv>)

## Power BI



This graphs are made by Power BI

## Preperation

```
# Please first download required library
library(tidyverse)
library(ggplot2)
library(dplyr)
library(rvest)
library(stringr)
library(corrplot)
```

## General Information About Data Set

```
dt<-read.csv("C:/Users/gozde/Desktop/weather/GlobalWeatherRepository.csv")
set.seed(292)
rand_number_1 <- sample(x = 1:585, size = 200)
dt<-dt[rand_number_1,1:41]
summary(dt)
```

```

##      country      location_name      latitude      longitude
##      Length:200      Length:200      Min.   :-41.30      Min.   :-120.49
##      Class :character      Class :character      1st Qu.:  6.15      1st Qu.: -18.18
##      Mode  :character      Mode  :character      Median : 15.59      Median :  18.83
##                                     Mean  : 18.89      Mean   :  16.40
##                                     3rd Qu.: 40.63      3rd Qu.:  44.79
##                                     Max.   : 63.83      Max.   : 179.22
##      timezone      last_updated_epoch      last_updated      temperature_celsius
##      Length:200      Min.   :1.693e+09      Length:200      Min.   :  5.00
##      Class :character      1st Qu.:1.693e+09      Class :character      1st Qu.:18.77
##      Mode  :character      Median :1.693e+09      Mode  :character      Median :24.70
##                                     Mean  :1.693e+09      Mean   :23.27
##                                     3rd Qu.:1.693e+09      3rd Qu.:28.55
##                                     Max.   :1.693e+09      Max.   :42.00
##      temperature_fahrenheit      condition_text      wind_mph      wind_kph
##      Min.   : 41.00      Length:200      Min.   :  2.200      Min.   :  3.60
##      1st Qu.: 65.78      Class :character      1st Qu.:  3.800      1st Qu.:  6.10
##      Median : 76.45      Mode  :character      Median :  6.500      Median :10.45
##      Mean   : 73.89      Mean   :  7.444      Mean   :11.97
##      3rd Qu.: 83.40      3rd Qu.:  9.400      3rd Qu.:15.10
##      Max.   :107.60      Max.   :30.000      Max.   :48.20
##      wind_degree      wind_direction      pressure_mb      pressure_in
##      Min.   : 10.0      Length:200      Min.   :1000      Min.   :29.53
##      1st Qu.: 90.0      Class :character      1st Qu.:1007      1st Qu.:29.74
##      Median :176.5      Mode  :character      Median :1011      Median :29.85
##      Mean   :172.2      Mean   :1011      Mean   :29.86
##      3rd Qu.:240.0      3rd Qu.:1014      3rd Qu.:29.94
##      Max.   :360.0      Max.   :1034      Max.   :30.53
##      precip_mm      precip_in      humidity      cloud
##      Min.   : 0.0000      Min.   :0.0000      Min.   : 12.0      Min.   :  0.00
##      1st Qu.: 0.0000      1st Qu.:0.0000      1st Qu.: 56.0      1st Qu.:  6.00
##      Median : 0.0000      Median :0.0000      Median : 78.5      Median :32.00
##      Mean   : 0.4585      Mean   :0.0177      Mean   : 71.7      Mean   :39.55
##      3rd Qu.: 0.1000      3rd Qu.:0.0000      3rd Qu.: 89.0      3rd Qu.:75.00
##      Max.   :28.7000      Max.   :1.1300      Max.   :100.0      Max.   :100.00
##      feels_like_celsius      feels_like_fahrenheit      visibility_km      visibility_miles
##      Min.   : 3.60      Min.   :38.40      Min.   :  2.00      Min.   :  1.000
##      1st Qu.:18.77      1st Qu.: 65.78      1st Qu.:10.00      1st Qu.:  6.000
##      Median :26.55      Median : 79.80      Median :10.00      Median :  6.000
##      Mean   :25.21      Mean   : 77.38      Mean   :10.21      Mean   :  6.055
##      3rd Qu.:31.35      3rd Qu.: 88.47      3rd Qu.:10.00      3rd Qu.:  6.000
##      Max.   :59.10      Max.   :138.30      Max.   :24.00      Max.   :14.000
##      uv_index      gust_mph      gust_kph      air_quality_Carbon_Monoxide
##      Min.   :1.000      Min.   : 1.10      Min.   :  1.80      Min.   :140.2
##      1st Qu.:1.000      1st Qu.:  6.00      1st Qu.:  9.70      1st Qu.:219.5
##      Median :1.000      Median :  9.95      Median :16.00      Median :270.4
##      Mean   :2.965      Mean   :11.22      Mean   :18.06      Mean   :441.7
##      3rd Qu.:6.000      3rd Qu.:14.50      3rd Qu.:23.40      3rd Qu.:415.6
##      Max.   :9.000      Max.   :49.40      Max.   :79.60      Max.   :7370.0
##      air_quality_Ozone      air_quality_Nitrogen_dioxide      air_quality_Sulphur_dioxide
##      Min.   :  0.00      Min.   :  0.000      Min.   :  0.000
##      1st Qu.:18.95      1st Qu.:  0.775      1st Qu.:  0.300
##      Median :36.30      Median :  3.300      Median :  1.200
##      Mean   :43.70      Mean   :  8.845      Mean   :  5.965
##      3rd Qu.:59.05      3rd Qu.:  8.825      3rd Qu.:  5.225
##      Max.   :277.50      Max.   :98.700      Max.   :76.300
##      air_quality_PM2.5      air_quality_PM10      air_quality_us.epa.index
##      Min.   :  0.500      Min.   :  0.50      Min.   :1.00
##      1st Qu.:  2.975      1st Qu.:  4.70      1st Qu.:1.00
##      Median :  6.450      Median :  9.75      Median :1.00
##      Mean   :16.716      Mean   :26.00      Mean   :1.37
##      3rd Qu.:14.025      3rd Qu.:22.30      3rd Qu.:1.00
##      Max.   :496.200      Max.   :596.90      Max.   :6.00
##      air_quality_gb.defra.index      sunrise      sunset
##      Min.   :  1.00      Length:200      Length:200
##      1st Qu.:  1.00      Class :character      Class :character
##      Median :  1.00      Mode  :character      Mode  :character
##      Mean   :  1.82
##      3rd Qu.:  2.00
##      Max.   :10.00
##      moonrise      moonset      moon_phase      moon_illumination
##      Length:200      Length:200      Length:200      Min.   :93.00
##      Class :character      Class :character      Class :character      1st Qu.:93.00
##      Mode  :character      Mode  :character      Mode  :character      Median :98.00
##                                     Mean   :96.25
##                                     3rd Qu.:98.00
##                                     Max.   :98.00

```

- **country:** Country of the weather data
- **location\_name:** Name of the location (city)
- **latitude:** Latitude coordinate of the location
- **longitude:** Longitude coordinate of the location
- **timezone:** Timezone of the location
- **last\_updated\_epoch:** Unix timestamp of the last data update
- **last\_updated:** Local time of the last data update
- **temperature\_celsius:** Temperature in degrees Celsius
- **temperature\_fahrenheit:** Temperature in degrees Fahrenheit
- **condition\_text:** Weather condition description
- **wind\_mph:** Wind speed in miles per hour
- **wind\_kph:** Wind speed in kilometers per hour
- **wind\_degree:** Wind direction in degrees
- **wind\_direction:** Wind direction as a 16-point compass
- **pressure\_mb:** Pressure in millibars
- **pressure\_in:** Pressure in inches
- **precip\_mm:** Precipitation amount in millimeters
- **precip\_in:** Precipitation amount in inches
- **humidity:** Humidity as a percentage
- **cloud:** Cloud cover as a percentage
- **feels\_like\_celsius:** Feels-like temperature in Celsius
- **feels\_like\_fahrenheit:** Feels-like temperature in Fahrenheit
- **visibility\_km:** Visibility in kilometers
- **visibility\_miles:** Visibility in miles
- **uv\_index:** UV Index
- **gust\_mph:** Wind gust in miles per hour
- **gust\_kph:** Wind gust in kilometers per hour
- **air\_quality\_Carbon\_Monoxide:** Air quality measurement: Carbon Monoxide
- **air\_quality\_Ozone:** Air quality measurement: Ozone

- **air\_quality\_Nitrogen\_dioxide**: Air quality measurement: Nitrogen Dioxide
- **air\_quality\_Sulphur\_dioxide**: Air quality measurement: Sulphur Dioxide
- **air\_quality\_PM2.5**: Air quality measurement: PM2.5
- **air\_quality\_PM10**: Air quality measurement: PM10
- **air\_quality\_us-epa-index**: Air quality measurement: US EPA Index
- **air\_quality\_gb-defra-index**: Air quality measurement: GB DEFRA Index
- **sunrise**: Local time of sunrise
- **sunset**: Local time of sunset
- **moonrise**: Local time of moonrise
- **moonset**: Local time of moonset
- **moon\_phase**: Current moon phase
- **moon\_illumination**: Moon illumination percentage

Above information was taken from Kaggle  
(country:%20Country%20of%20the%20weather%20data%20location\_name:%20Name%20of%20the%20location%20(city)%20latitude:%20Latitude%20coordinate%20of%20the%20location%20longitude:point%20compass%20pressure\_mb:%20Pressure%20in%20millibars%20pressure\_in:%20Pressure%20in%20inches%20precip\_mm:%20Precipitation%20amount%20in%20millimeters%20precip\_in:%20like%20temperature%20in%20Celsius%20feels\_like\_fahrenheit:%20Feels-like%20temperature%20in%20Fahrenheit%20visibility\_km:%20Visibility%20in%20kilometers%20visibility\_miles:%20Visibility%20in%20miles%20uv\_index:%20UV%20Index%20gust\_mph:%20Wind%20epa-index:%20Air%20quality%20measurement:%20US%20EPA%20Index%20air\_quality\_gb-defra-index:%20Air%20quality%20measurement:%20GB%20DEFRA%20Index%20sunrise:%20Local%20time%20of%20sunrise%20sunset:%20Local%20time%20of%20sunset%20moonrise:%20Local%20tim

## Plot of Weather Data

Since this data set so big to see any pattern we use small sample.

```
set.seed(291)
```

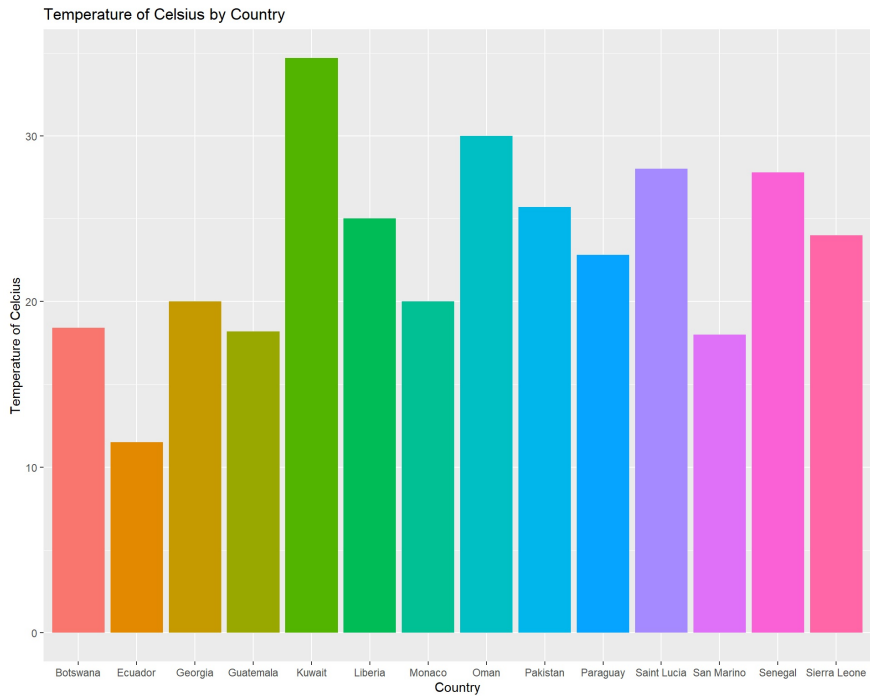
```
rand_number_2 <- sample(x = 1:200, size = 15)
```

```
dt_plot<-dt[rand_number_2,1:41]
```

```
set.seed(291)
rand_number_2 <- sample(x = 1:200, size = 15)
dt_plot<-dt[rand_number_2,1:41]
```

## Temperature of Celsius by Country

```
ggplot(data = dt_plot, aes(x = country, y = temperature_celsius, fill = country)) +
  geom_bar(stat = "identity", position = "dodge",show.legend = F)+
  labs(title="Temperature of Celsius by Country")+
  xlab("Country")+ylab("Temperature of Celcius")
```

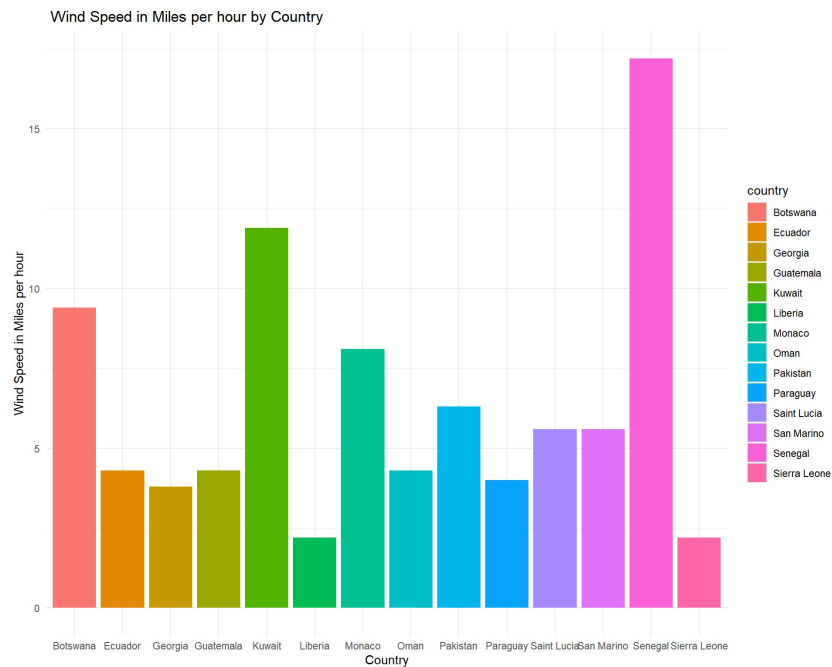


As we can understand from this graph between these 15 countries the hottest country is Kuwait. The coldest country is Ecuador.

- According to NBC News (<https://www.nbcnews.com/science/environment/kuwait-worlds-hottest-places-lags-climate-action-rcna20830>) : Kuwait reached a scorching temperature of 53.2 degrees Celsius (127.7 degrees Fahrenheit), making it among the hottest places on earth.

## Wind Speed in Miles per hour by Country

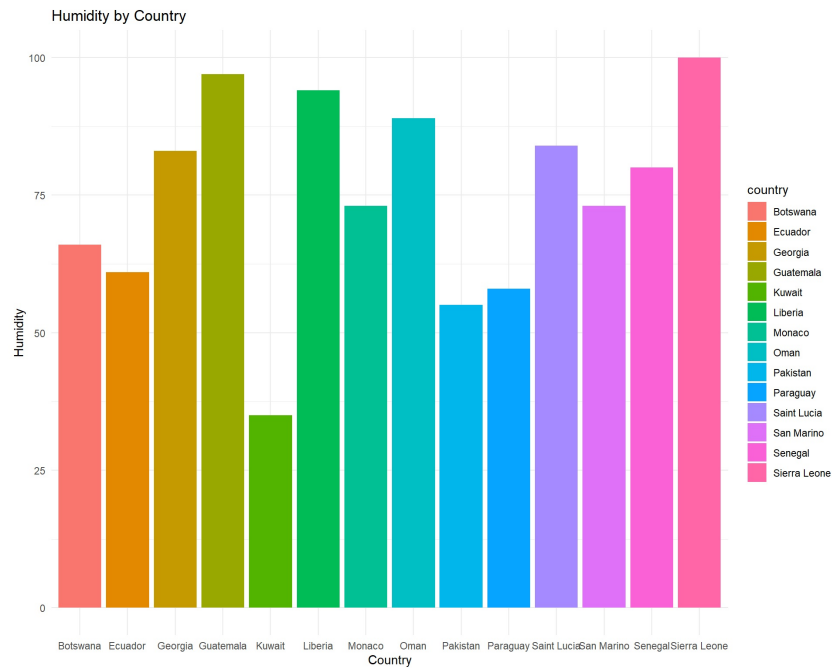
```
ggplot(data = dt_plot, aes(x = country, y = wind_mph, fill = country)) +
  geom_bar(stat = "identity", position = "dodge")+
  labs(title=" Wind Speed in Miles per hour by Country")+
  xlab("Country")+ylab("Wind Speed in Miles per hour")+theme_minimal()
```



Senegal is the windiest place between these 15 countries.

## Humidity by Country

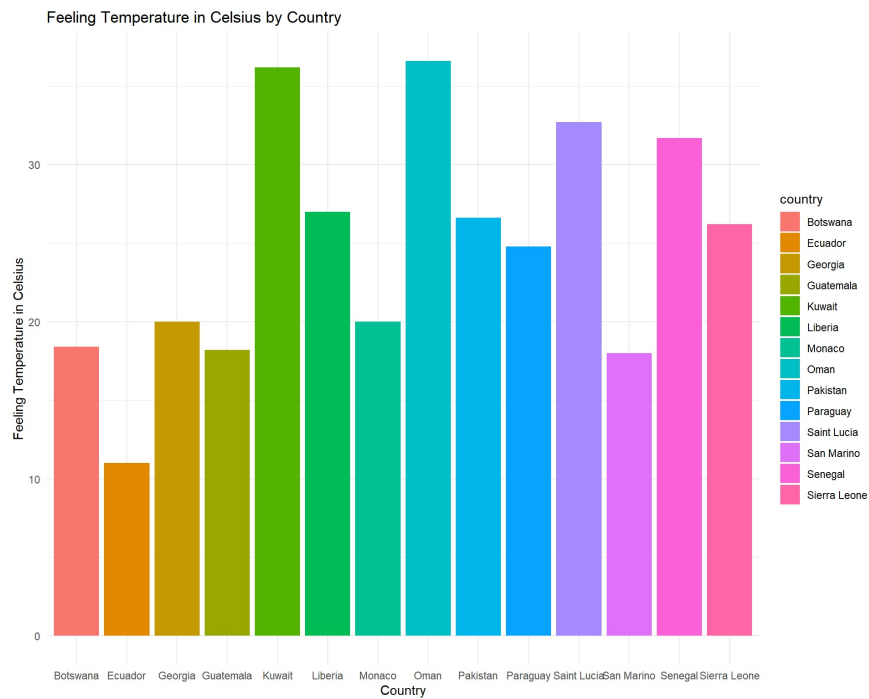
```
ggplot(data = dt_plot, aes(x = country, y = humidity, fill = country)) +  
  geom_bar(stat = "identity", position = "dodge") +  
  labs(title = "Humidity by Country") +  
  xlab("Country") + ylab("Humidity") + theme_minimal()
```



All countries are mostly high except Kuwait. Also, as we discussed, Kuwait is a hot country, so this affects the humidity.

## Feels-like temperature in Celsius by Country

```
ggplot(data = dt_plot, aes(x = country, y = feels_like_celsius, fill = country)) +  
  geom_bar(stat = "identity", position = "dodge") +  
  labs(title = "Feeling Temperature in Celsius by Country") +  
  xlab("Country") + ylab("Feeling Temperature in Celsius") + theme_minimal()
```



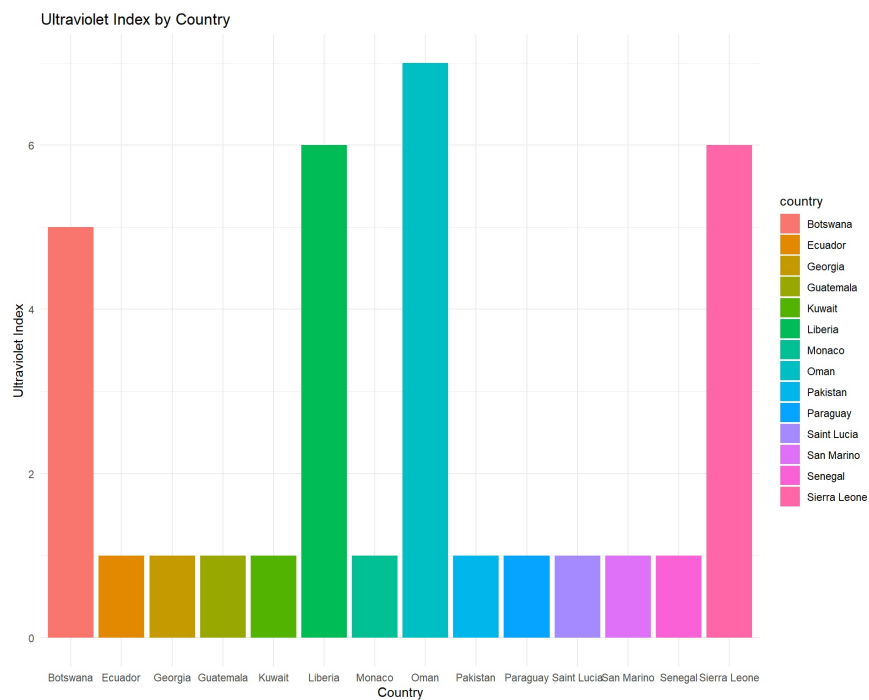
As we expected Kuwait's feels-like temperature is high since its humidity and normal temperature is high.

## Ultraviolet Index by Country

According to the Wikipedia ([https://en.wikipedia.org/wiki/Ultraviolet\\_index](https://en.wikipedia.org/wiki/Ultraviolet_index)) :

The **ultraviolet index**, or **UV index**, is an international standard measurement of the strength of the sunburn (<https://en.wikipedia.org/wiki/Sunburn>)-producing ultraviolet (<https://en.wikipedia.org/wiki/Ultraviolet>) (UV) radiation (<https://en.wikipedia.org/wiki/Radiation>) at a particular place and time.

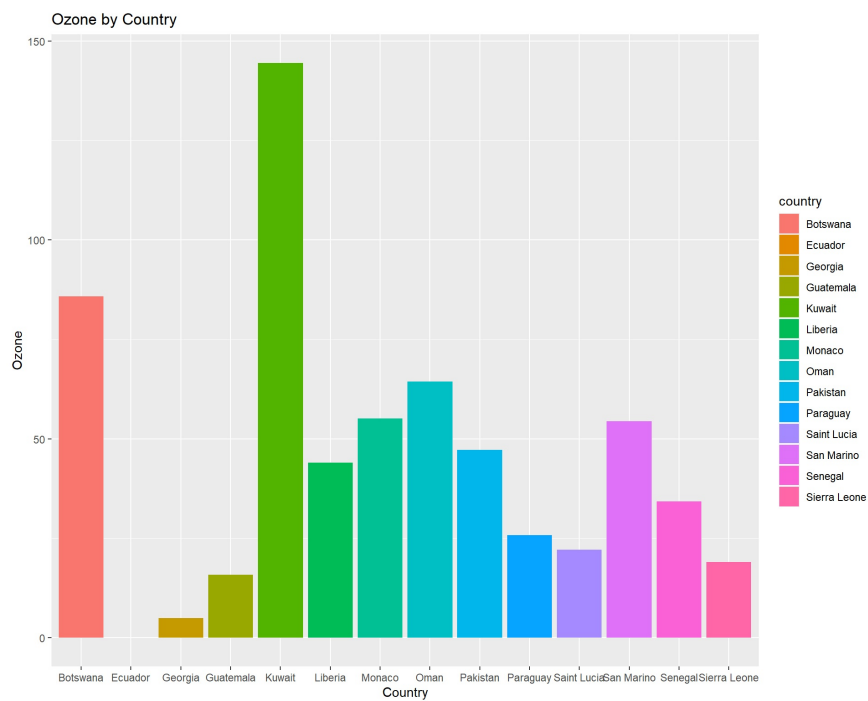
```
ggplot(data = dt_plot, aes(x = country, y =uv_index , fill = country)) +
  geom_bar(stat = "identity", position = "dodge")+
  labs(title="Ultraviolet Index by Country")+
  xlab("Country")+ylab("Ultraviolet Index")+theme_minimal()
```



Oman has the most uv\_index.

## Ozone by Country

```
ggplot(data = dt_plot, aes(x = country, y =air_quality_Ozone , fill = country)) +
  geom_bar(stat = "identity", position = "dodge")+
  labs(title="Ozone by Country")+
  xlab("Country")+ylab("Ozone")
```



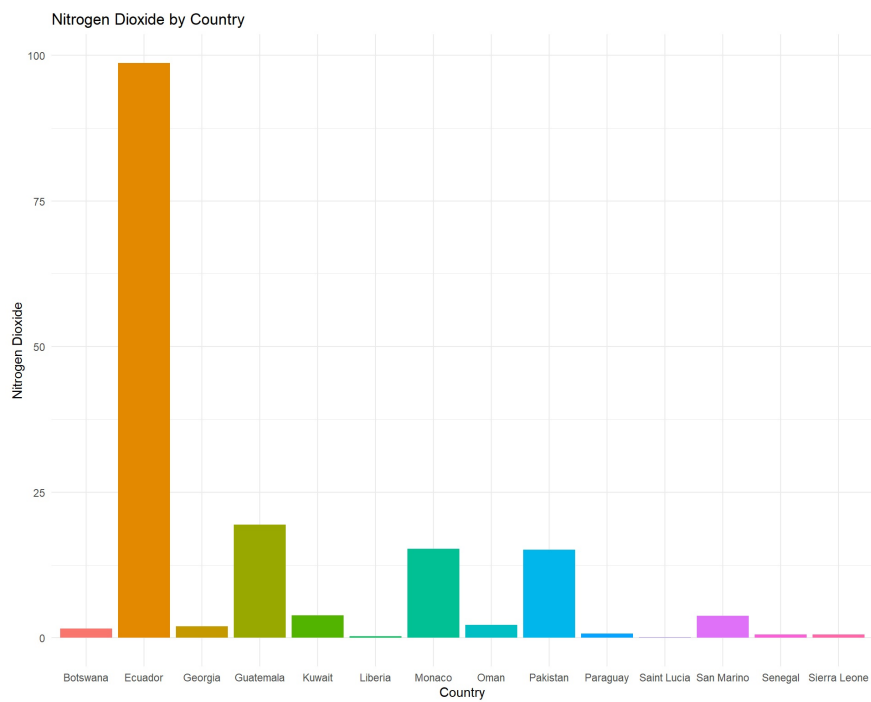
Kuwait's ozone level is really high. This is bad because ozone is really harmful for people's health.

According to the Answer More (<https://www.answersmore.com/what-happens-if-there-is-too-much-ozone/>) :

Ozone makes people more sensitive to allergens—the most common triggers for asthma attacks. Also, asthmatics may be more severely affected by reduced lung function and airway inflammation.

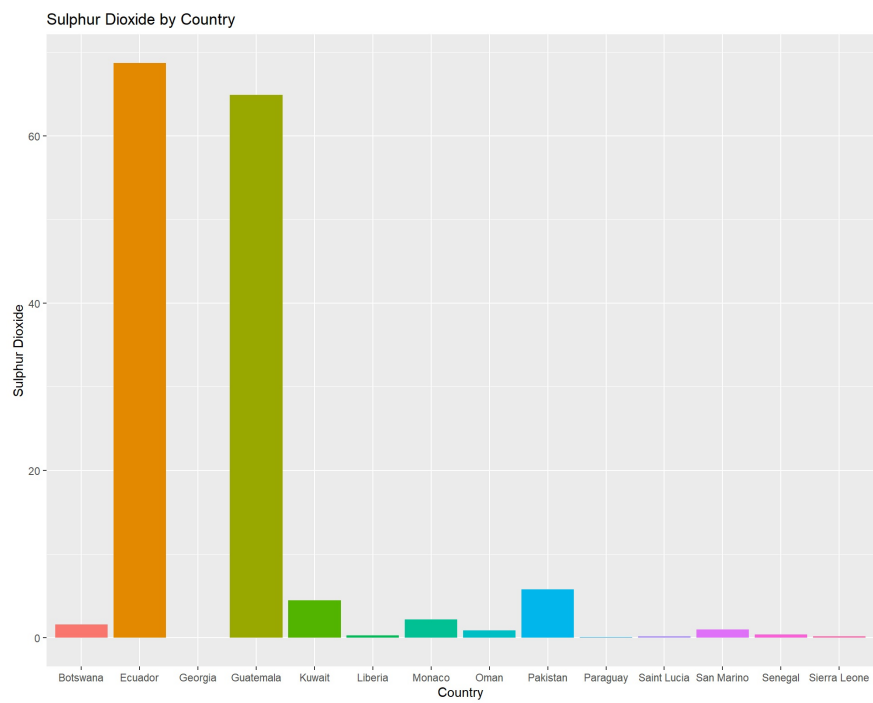
### Nitrogen dioxide by Country

```
ggplot(data = dt_plot, aes(x = country, y =air_quality_Nitrogen_dioxide , fill = country)) +
  geom_bar(stat = "identity", position = "dodge",show.legend = F)+
  labs(title="Nitrogen Dioxide by Country")+
  xlab("Country")+ylab("Nitrogen Dioxide")+theme_minimal()
```



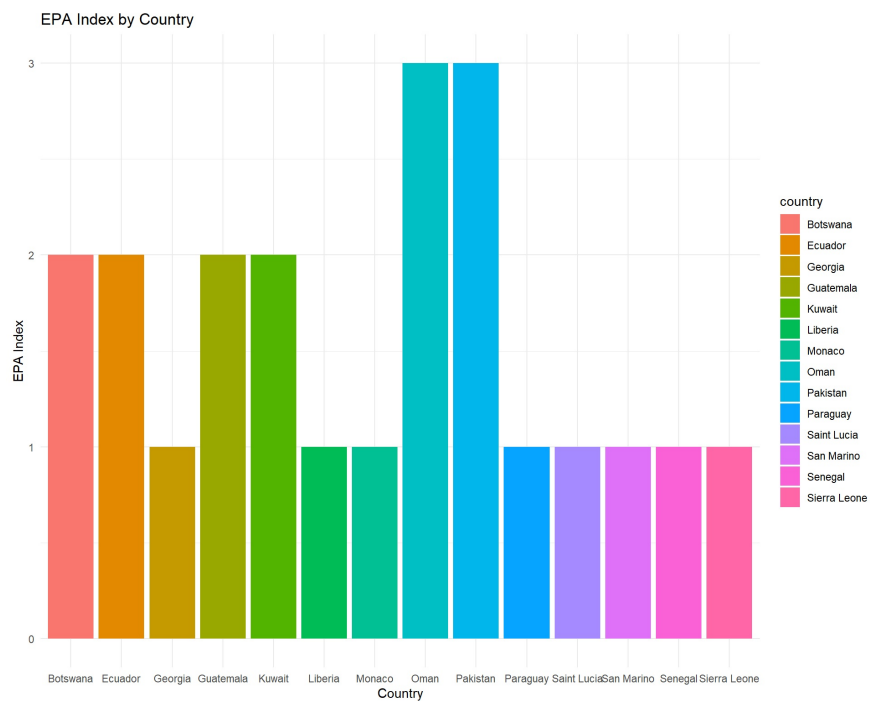
### Sulphur Dioxide by Country

```
ggplot(data = dt_plot, aes(x = country, y =air_quality_Sulphur_dioxide , fill = country)) +
  geom_bar(stat = "identity", position = "dodge",show.legend = F)+
  labs(title="Sulphur Dioxide by Country")+
  xlab("Country")+ylab("Sulphur Dioxide")
```



### EPA Index by country

```
ggplot(data = dt_plot, aes(x = country, y = air_quality_us.epa.index, fill = country)) +  
  geom_bar(stat = "identity", position = "dodge") +  
  labs(title = "EPA Index by Country") +  
  xlab("Country") + ylab("EPA Index") +  
  theme_minimal()
```



For more information about US EPA Index. Look at the below image.

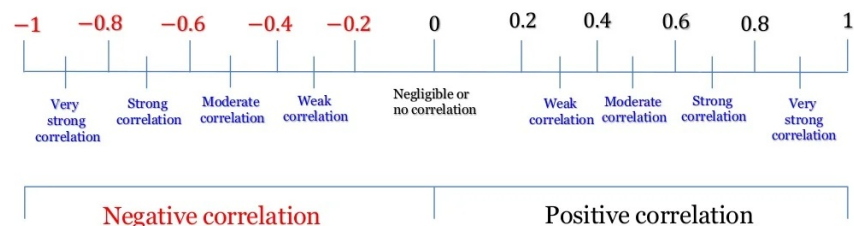
US EPA Air Quality Index			
Air Quality	Air Quality Index	PM <sub>2.5</sub> (µg/m³)	Health Advisory
Good	0-50	≤15	None.
Moderate	51-100	16-40	Unusually sensitive people should consider reducing prolonged or heavy exertion.
Unhealthy for Sensitive Groups	101-150	41-75	People with heart or lung disease, older adults, and children should reduce prolonged or heavy exertion.
Unhealthy	151-200	66-150	People with heart or lung disease, older adults, and children should avoid prolonged or heavy exertion. Everyone else should reduce prolonged or heavy exertion.
Very Unhealthy	201-300	151-250	People with heart or lung disease, older adults, and children should avoid all physical activity outdoors. Everyone else should avoid prolonged or heavy exertion.
Hazardous	≥301	≥251	People with heart or lung disease, older adults, and children should remain indoors and keep activity levels low. Everyone else should avoid all physical activity outdoors.

Correlation matrix: correlations for all variables

If you do not have information about correlation matrix. Here is the general summary information:

Correlation Coefficient Interpretation Guideline

The correlation coefficient (r) ranges from -1 (a perfect negative correlation) to 1 (a perfect positive correlation). In short,  $-1 \leq r \leq 1$ .



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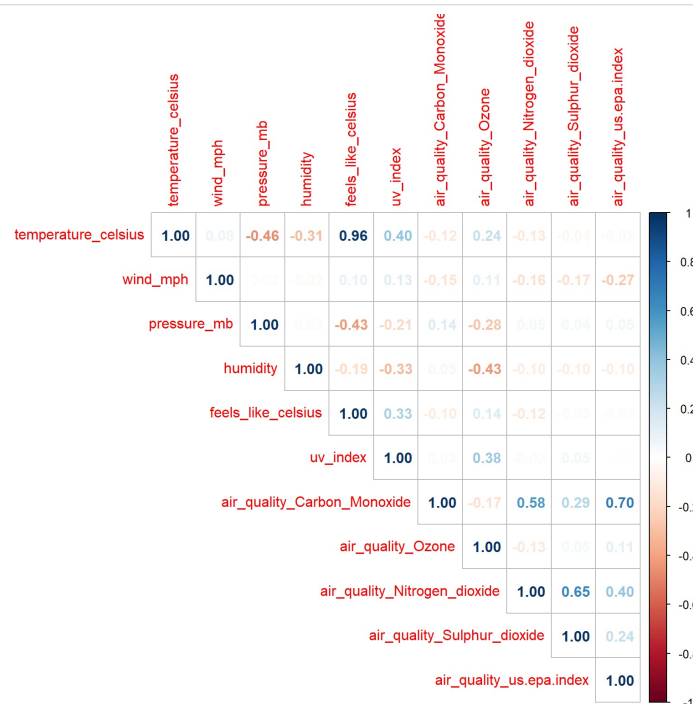
```
dt_cor<-dt[c(8,11,15,19,21,25,28,29,30,31,34)]
round(cor(dt_cor),
      digits = 2 # rounded to 2 decimals
    )
```



```
## temperature_celsius wind_mph pressure_mb humidity
## temperature_celsius      1.00      0.08     -0.46    -0.31
## wind_mph                  0.08      1.00      0.02    -0.02
## pressure_mb              -0.46      0.02      1.00     0.03
## humidity                 -0.31     -0.02      0.03     1.00
## feels_like_celsius        0.96      0.10     -0.43    -0.19
## uv_index                  0.40      0.13     -0.21    -0.33
## air_quality_Carbon_Monoxide -0.12    -0.15      0.14     0.05
## air_quality_Ozone          0.24      0.11     -0.28    -0.43
## air_quality_Nitrogen_dioxide -0.13   -0.16      0.05    -0.10
## air_quality_Sulphur_dioxide -0.04   -0.17      0.04    -0.10
## air_quality_us.epa.index  -0.02   -0.27      0.05    -0.10
##
## feels_like_celsius uv_index
## temperature_celsius      0.96      0.40
## wind_mph                  0.10      0.13
## pressure_mb              -0.43    -0.21
## humidity                 -0.19   -0.33
## feels_like_celsius        1.00      0.33
## uv_index                  0.33      1.00
## air_quality_Carbon_Monoxide -0.10     0.03
## air_quality_Ozone          0.14      0.38
## air_quality_Nitrogen_dioxide -0.12   -0.02
## air_quality_Sulphur_dioxide -0.03     0.05
## air_quality_us.epa.index  -0.02     0.01
##
## air_quality_Carbon_Monoxide air_quality_Ozone
## temperature_celsius      -0.12      0.24
## wind_mph                  -0.15      0.11
## pressure_mb               -0.14     -0.28
## humidity                  0.05     -0.43
## feels_like_celsius       -0.10      0.14
## uv_index                  0.03      0.38
## air_quality_Carbon_Monoxide 1.00    -0.17
## air_quality_Ozone          -0.17      1.00
## air_quality_Nitrogen_dioxide 0.58    -0.13
## air_quality_Sulphur_dioxide 0.29      0.05
## air_quality_us.epa.index  0.70      0.11
##
## air_quality_Nitrogen_dioxide
## temperature_celsius      -0.13
## wind_mph                 -0.16
## pressure_mb              0.05
## humidity                -0.10
## feels_like_celsius       -0.12
## uv_index                 -0.02
## air_quality_Carbon_Monoxide 0.58
## air_quality_Ozone         -0.13
## air_quality_Nitrogen_dioxide 1.00
## air_quality_Sulphur_dioxide 0.65
## air_quality_us.epa.index  0.40
##
## air_quality_Sulphur_dioxide
## temperature_celsius      -0.04
## wind_mph                 -0.17
## pressure_mb              0.04
## humidity                -0.10
## feels_like_celsius       -0.03
## uv_index                 0.05
## air_quality_Carbon_Monoxide 0.29
## air_quality_Ozone         0.05
## air_quality_Nitrogen_dioxide 0.65
## air_quality_Sulphur_dioxide 1.00
## air_quality_us.epa.index  0.24
##
## air_quality_us.epa.index
## temperature_celsius      -0.02
## wind_mph                 -0.27
## pressure_mb              0.05
## humidity                -0.10
## feels_like_celsius       -0.02
## uv_index                 0.01
## air_quality_Carbon_Monoxide 0.70
## air_quality_Ozone         0.11
## air_quality_Nitrogen_dioxide 0.40
## air_quality_Sulphur_dioxide 0.24
## air_quality_us.epa.index  1.00
```

To be more easy to read, let's make as a plot.

```
corrplot(cor(dt_cor),
  method = "number",
  type = "upper" # show only upper side
)
```



Time to interpretation:

As we can guess there is a high positive correlation between temperature Celsius and feels like Celsius.

Also, Carbon monoxide and the US EPA Index are highly positively correlated to each other.

Carbon monoxide and nitrogen dioxide are moderately positively correlated to each other.

Pressure mb and feels like Celsius are moderately negatively correlated to each other.

Also, Ozone and humidity are moderately negatively correlated.

## Linear Regression

If you do not have information about linear regression. Here is the general summary information:

### Simple Linear Regression Model

$$y = \beta_0 + \beta_1 x + \varepsilon$$

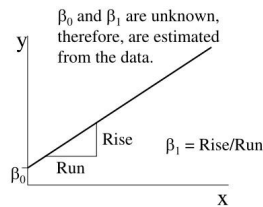
y = dependent variable

x = independent variable

$\beta_0$  = intercept

$\beta_1$  = slope of the line

$\varepsilon$  = error variable



6

Once we have identified two variables that are correlated, we would like to model this relationship. We want to use one variable as a **predictor** or **explanatory** variable to explain the other variable, the **response** or **dependent** variable. In order to do this, we need a good relationship between our two variables. The model can then be used to predict changes in our response variable. A strong relationship between the predictor variable and the response variable leads to a good model.

### Ozone and Humidity

```
linear1 <- lm( air_quality_Ozone~ humidity, data=dt_plot)
linear1
```

```
##
## Call:
## lm(formula = air_quality_Ozone ~ humidity, data = dt_plot)
##
## Coefficients:
## (Intercept)      humidity
##      120.740         -1.072
```

Ozone=120.740+(-1.072)\*Humidity

### Carbon Monoxide and Nitrogen Dioxide

```
linear2 <- lm( air_quality_Carbon_Monoxide~air_quality_Nitrogen_dioxide , data=dt_plot)
linear2
```

```
##
## Call:
## lm(formula = air_quality_Carbon_Monoxide ~ air_quality_Nitrogen_dioxide,
##     data = dt_plot)
##
## Coefficients:
##              (Intercept)  air_quality_Nitrogen_dioxide
##              153.10         40.41
```

Carbon Monoxide=153.10+40.41\*Nitrogen Dioxide

### Pressure mb and Feels Like Celsius

```
linear3 <- lm( pressure_mb~ feels_like_celsius, data=dt_plot)
linear3
```

```
##
## Call:
## lm(formula = pressure_mb ~ feels_like_celsius, data = dt_plot)
##
## Coefficients:
## (Intercept)  feels_like_celsius
##      1027.0463         -0.5809
```

Pressure mb=1027.0463-0.5809\*(Feels Like Celsius)

### Carbon Monoxide and the US EPA Index

```
linear4 <- lm( air_quality_us.epa.index~ air_quality_Carbon_Monoxide, data=dt_plot)
linear4
```

```
##
## Call:
## lm(formula = air_quality_us.epa.index ~ air_quality_Carbon_Monoxide,
##     data = dt_plot)
##
## Coefficients:
##              (Intercept)  air_quality_Carbon_Monoxide
##              1.4165158         0.0001949
```

EPA Index=1.4165+(0.00019)\*Carbon Monoxide

### Temperature Celsius and Feels Like Celsius

```
linear5 <- lm( feels_like_celsius~temperature_celsius , data=dt_plot)
linear5
```

```
##  
## Call:  
## lm(formula = feels_like_celsius ~ temperature_celsius, data = dt_plot)  
##  
## Coefficients:  
##      (Intercept)  temperature_celsius  
##          -3.469             1.224
```

Feels Like Celsius= $(-3.469)+1.224 \times$ Temperature Celsius