

615 HW4

This is an R Markdown Notebook. When you execute code within the notebook, the results appear beneath the code.

Try executing this chunk by clicking the *Run* button within the chunk or by placing your cursor inside it and pressing *Cmd+Shift+Enter*.

1. Downloading the data

```
library(data.table)
file_root <- "https://www.ndbc.noaa.gov/view_text_file.php?filename=44013h"
year <- "2023"
tail <- ".txt.gz&dir=data/historical/stdmet/"
all_years_data <- list()
for (year in 1985:2023) {
  path <- paste0(file_root, year, tail)
  print(paste("Downloading and reading data for year:", year))
  try({
    header <- scan(path, what = 'character', nlines = 1, quiet = TRUE)
    buoy <- fread(path, header = FALSE, skip = 2)
    colnames(buoy) <- header
    buoy[, Year := year]
    all_years_data[[as.character(year)]] <- buoy
  }, silent = TRUE)
}
```

```
## [1] "Downloading and reading data for year: 1985"
## [1] "Downloading and reading data for year: 1986"
## [1] "Downloading and reading data for year: 1987"
## [1] "Downloading and reading data for year: 1988"
## [1] "Downloading and reading data for year: 1989"
## [1] "Downloading and reading data for year: 1990"
## [1] "Downloading and reading data for year: 1991"
## [1] "Downloading and reading data for year: 1992"
## [1] "Downloading and reading data for year: 1993"
## [1] "Downloading and reading data for year: 1994"
## [1] "Downloading and reading data for year: 1995"
## [1] "Downloading and reading data for year: 1996"
## [1] "Downloading and reading data for year: 1997"
## [1] "Downloading and reading data for year: 1998"
## [1] "Downloading and reading data for year: 1999"
## [1] "Downloading and reading data for year: 2000"

## Warning in fread(path, header = FALSE, skip = 2): Stopped early on line 5114.
## Expected 16 fields but found 17. Consider fill=TRUE and comment.char=. First
## discarded non-empty line: <<2000 08 01 00 78 4.3 5.1 0.58 8.33 5.36 999 1022.9
## 17.3 17.5 15.0 99.0 99.00>>

## [1] "Downloading and reading data for year: 2001"
## [1] "Downloading and reading data for year: 2002"
```

```
## [1] "Downloading and reading data for year: 2003"
## [1] "Downloading and reading data for year: 2004"
## [1] "Downloading and reading data for year: 2005"
## [1] "Downloading and reading data for year: 2006"
## [1] "Downloading and reading data for year: 2007"
## [1] "Downloading and reading data for year: 2008"
## [1] "Downloading and reading data for year: 2009"
## [1] "Downloading and reading data for year: 2010"
## [1] "Downloading and reading data for year: 2011"
## [1] "Downloading and reading data for year: 2012"
## [1] "Downloading and reading data for year: 2013"
## [1] "Downloading and reading data for year: 2014"
## [1] "Downloading and reading data for year: 2015"
## [1] "Downloading and reading data for year: 2016"
## [1] "Downloading and reading data for year: 2017"
## [1] "Downloading and reading data for year: 2018"
## [1] "Downloading and reading data for year: 2019"
## [1] "Downloading and reading data for year: 2020"
## [1] "Downloading and reading data for year: 2021"
## [1] "Downloading and reading data for year: 2022"
## [1] "Downloading and reading data for year: 2023"
```

```
combined_data <- rbindlist(all_years_data, use.names = TRUE, fill = TRUE)
head(combined_data)
```

```
##      YY      MM      DD      hh      WD      WSPD      GST      WVHT      DPD      APD      MWD      BAR
##      <int> <int> <int> <int> <int> <num> <num> <num> <num> <num> <int> <num>
## 1:    85      1      1      1      80      4      5      99      99      99      999 1030.0
## 2:    85      1      1      2     100      4      5      99      99      99      999 1030.1
## 3:    85      1      1      3     100      4      5      99      99      99      999 1029.4
## 4:    85      1      1      4     110      4      5      99      99      99      999 1028.6
## 5:    85      1      1      5      90      4      5      99      99      99      999 1027.8
## 6:    85      1      1      6      60      4      6      99      99      99      999 1027.7
##      ATMP      WTMP      DEWP      VIS      Year      YYYY      TIDE      mm      #YY      WDIR      PRES
##      <num> <num> <num> <num> <int> <int> <num> <int> <int> <int> <num>
## 1:    5.1      6.7      999      99 1985      NA      NA      NA      NA      NA      NA
## 2:    5.6      6.6      999      99 1985      NA      NA      NA      NA      NA      NA
## 3:    5.8      6.7      999      99 1985      NA      NA      NA      NA      NA      NA
## 4:    5.8      6.7      999      99 1985      NA      NA      NA      NA      NA      NA
## 5:    5.3      6.7      999      99 1985      NA      NA      NA      NA      NA      NA
## 6:    5.5      6.7      999      99 1985      NA      NA      NA      NA      NA      NA
```

2.Changing the 999 and 99 to NA, since I found some data cannot be 99 so many times.

```
head(combined_data)
```

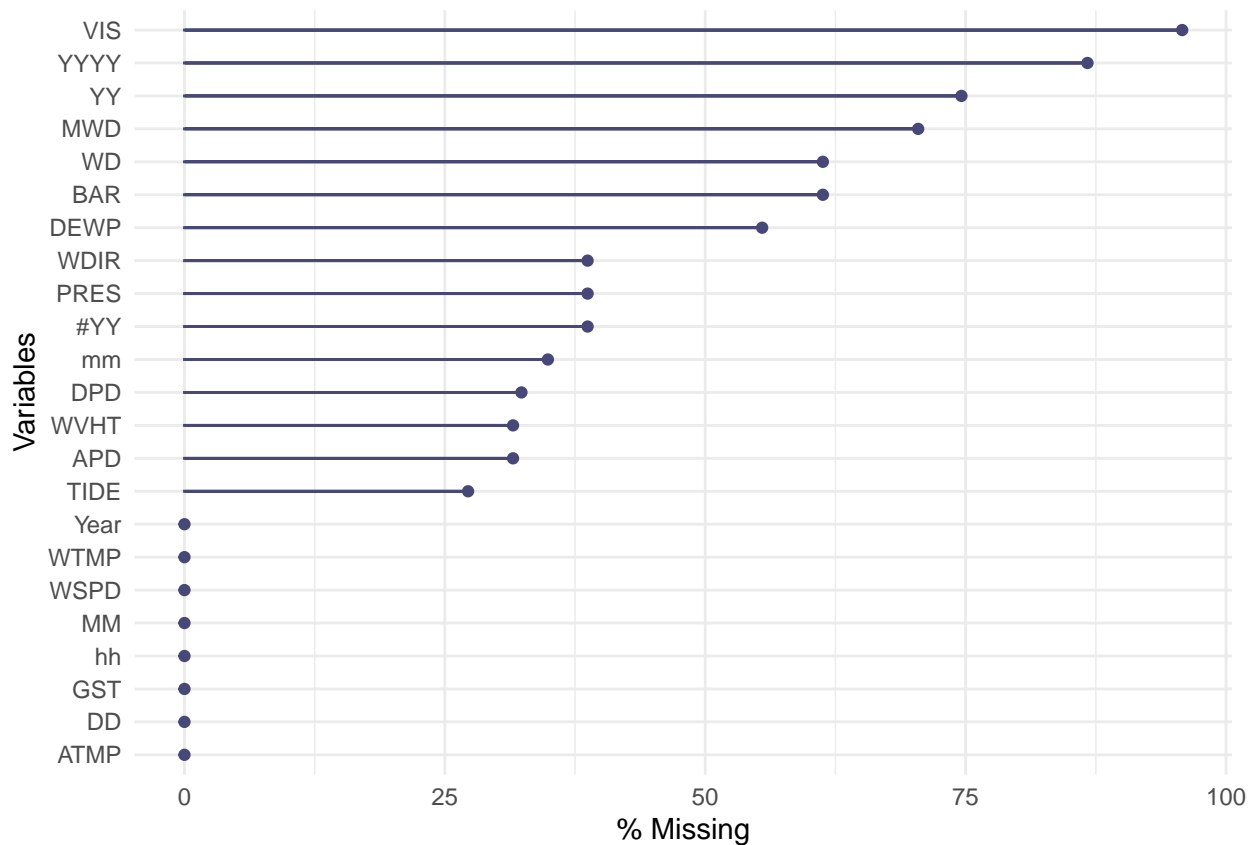
```
##      YY      MM      DD      hh      WD      WSPD      GST      WVHT      DPD      APD      MWD      BAR
##      <int> <int> <int> <int> <int> <num> <num> <num> <num> <num> <int> <num>
## 1:    85      1      1      1      80      4      5      99      99      99      999 1030.0
## 2:    85      1      1      2     100      4      5      99      99      99      999 1030.1
## 3:    85      1      1      3     100      4      5      99      99      99      999 1029.4
## 4:    85      1      1      4     110      4      5      99      99      99      999 1028.6
## 5:    85      1      1      5      90      4      5      99      99      99      999 1027.8
## 6:    85      1      1      6      60      4      6      99      99      99      999 1027.7
##      ATMP      WTMP      DEWP      VIS      Year      YYYY      TIDE      mm      #YY      WDIR      PRES
##      <num> <num> <num> <num> <int> <int> <num> <int> <int> <int> <num>
```

```
## 1:  5.1  6.7  999   99 1985   NA   NA   NA   NA   NA   NA
## 2:  5.6  6.6  999   99 1985   NA   NA   NA   NA   NA   NA
## 3:  5.8  6.7  999   99 1985   NA   NA   NA   NA   NA   NA
## 4:  5.8  6.7  999   99 1985   NA   NA   NA   NA   NA   NA
## 5:  5.3  6.7  999   99 1985   NA   NA   NA   NA   NA   NA
## 6:  5.5  6.7  999   99 1985   NA   NA   NA   NA   NA   NA
```

```
missing_columns <- c("WVHT", "DPD", "APD", "MWD", "DEWP", "VIS")
for (col in missing_columns) {
  combined_data[[col]][combined_data[[col]] == 999] <- NA
}
for (col in missing_columns) {
  combined_data[[col]][combined_data[[col]] == 99] <- NA
}
head(combined_data)
```

```
##      YY    MM    DD    hh    WD  WSPD   GST  WVHT   DPD   APD   MWD   BAR
##    <int> <int> <int> <int> <int> <num> <num> <num> <num> <num> <int> <num>
## 1:   85     1     1     1    80     4     5    NA    NA    NA    NA 1030.0
## 2:   85     1     1     2   100     4     5    NA    NA    NA    NA 1030.1
## 3:   85     1     1     3   100     4     5    NA    NA    NA    NA 1029.4
## 4:   85     1     1     4   110     4     5    NA    NA    NA    NA 1028.6
## 5:   85     1     1     5    90     4     5    NA    NA    NA    NA 1027.8
## 6:   85     1     1     6    60     4     6    NA    NA    NA    NA 1027.7
##      ATMP  WTMP  DEWP   VIS  Year  YYYY  TIDE   mm   #YY  WDIR  PRES
##    <num> <num> <num> <num> <int> <int> <num> <int> <int> <int> <num>
## 1:   5.1   6.7    NA    NA 1985    NA    NA    NA    NA    NA    NA
## 2:   5.6   6.6    NA    NA 1985    NA    NA    NA    NA    NA    NA
## 3:   5.8   6.7    NA    NA 1985    NA    NA    NA    NA    NA    NA
## 4:   5.8   6.7    NA    NA 1985    NA    NA    NA    NA    NA    NA
## 5:   5.3   6.7    NA    NA 1985    NA    NA    NA    NA    NA    NA
## 6:   5.5   6.7    NA    NA 1985    NA    NA    NA    NA    NA    NA
```

```
library(naniar)
gg_miss_var(combined_data, show_pct = TRUE)
```



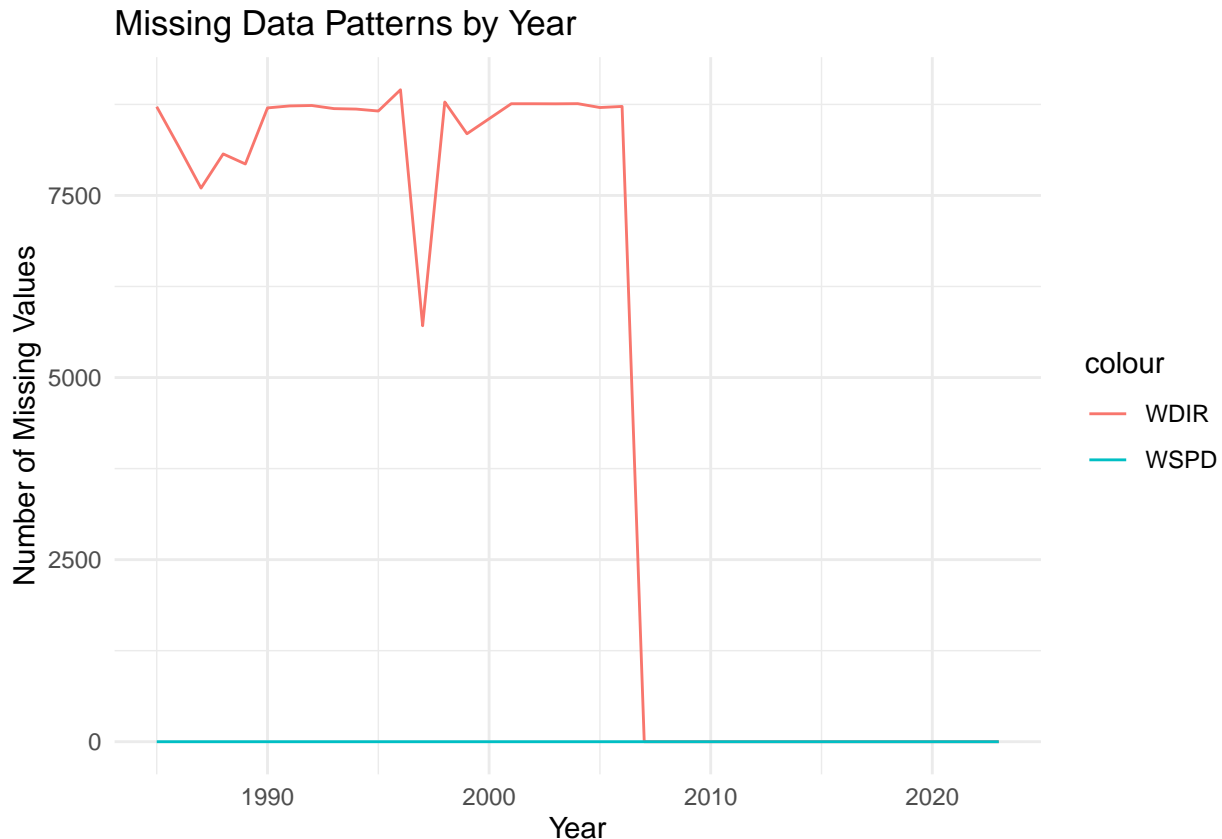
```
missing_by_year <- combined_data[, lapply(.SD, function(x) sum(is.na(x))), by = Year]
print(missing_by_year)
```

##	Year	YY	MM	DD	hh	WD	WSPD	GST	WVHT	DPD	APD	MWD
##	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>
## 1:	1985	0	0	0	0	0	0	0	8718	8718	8718	8718
## 2:	1986	0	0	0	0	0	0	0	3079	3079	3079	8167
## 3:	1987	0	0	0	0	0	0	0	88	88	88	7601
## 4:	1988	0	0	0	0	0	0	0	53	53	53	8070
## 5:	1989	0	0	0	0	0	0	0	134	135	134	7932
## 6:	1990	0	0	0	0	0	0	0	49	50	49	8702
## 7:	1991	0	0	0	0	0	0	0	15	20	15	8729
## 8:	1992	0	0	0	0	0	0	0	48	48	48	8735
## 9:	1993	0	0	0	0	0	0	0	125	125	125	6676
## 10:	1994	0	0	0	0	0	0	0	141	141	141	281
## 11:	1995	0	0	0	0	0	0	0	8	8	8	158
## 12:	1996	0	0	0	0	0	0	0	328	328	328	474
## 13:	1997	0	0	0	0	0	0	0	344	344	344	1589
## 14:	1998	0	0	0	0	0	0	0	206	206	206	8783
## 15:	1999	8347	0	0	0	0	0	0	113	113	113	8347
## 16:	2001	8759	0	0	0	0	0	0	53	53	53	8759
## 17:	2002	8759	0	0	0	0	0	0	58	58	58	8759
## 18:	2003	8758	0	0	0	0	0	0	90	92	90	8758
## 19:	2004	8760	0	0	0	0	0	0	61	66	61	8760
## 20:	2005	8707	0	0	0	0	0	0	86	86	86	8707
## 21:	2006	8722	0	0	0	0	0	0	63	63	63	8722
## 22:	2007	8694	0	0	0	8694	0	0	64	64	64	8694

## 23:	2008	8745	0	0	0	8745	0	0	94	298	94	8745
## 24:	2009	8732	0	0	0	8732	0	0	56	237	56	8732
## 25:	2010	7844	0	0	0	7844	0	0	50	227	50	7844
## 26:	2011	8746	0	0	0	8746	0	0	548	715	548	8746
## 27:	2012	4409	0	0	0	4409	0	0	107	233	107	307
## 28:	2013	8209	0	0	0	8209	0	0	356	706	356	817
## 29:	2014	8753	0	0	0	8753	0	0	26	294	26	438
## 30:	2015	8749	0	0	0	8749	0	0	32	385	32	489
## 31:	2016	8695	0	0	0	8695	0	0	8	354	8	454
## 32:	2017	8696	0	0	0	8696	0	0	1	210	1	305
## 33:	2018	8660	0	0	0	8660	0	0	1	245	1	327
## 34:	2019	8613	0	0	0	8613	0	0	0	213	0	293
## 35:	2020	16103	0	0	0	16103	0	0	7559	7820	7559	7926
## 36:	2021	51563	0	0	0	51563	0	0	43279	43595	43279	43691
## 37:	2022	52529	0	0	0	52529	0	0	42835	42939	42835	43074
## 38:	2023	52480	0	0	0	52480	0	0	35344	35503	35344	35729
##	Year	YY	MM	DD	hh	WD	WSPD	GST	WVHT	DPD	APD	MWD
##	BAR	ATMP	WTMP	DEWP	VIS	YYYY	TIDE	mm	#YY	WDIR	PRES	
##	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	<int>	
## 1:	0	0	0	8718	8718	8718	8718	8718	8718	8718	8718	
## 2:	0	0	0	8167	8167	8167	8167	8167	8167	8167	8167	
## 3:	0	0	0	7601	7601	7601	7601	7601	7601	7601	7601	
## 4:	0	0	0	8070	8070	8070	8070	8070	8070	8070	8070	
## 5:	0	0	0	7932	7932	7932	7932	7932	7932	7932	7932	
## 6:	0	0	0	8702	8702	8702	8702	8702	8702	8702	8702	
## 7:	0	0	0	8729	8729	8729	8729	8729	8729	8729	8729	
## 8:	0	0	0	8735	8735	8735	8735	8735	8735	8735	8735	
## 9:	0	0	0	8692	6651	8692	8692	8692	8692	8692	8692	
## 10:	0	0	0	8686	141	8686	8686	8686	8686	8686	8686	
## 11:	0	0	0	8659	8	8659	8659	8659	8659	8659	8659	
## 12:	0	0	0	8951	8951	8951	8951	8951	8951	8951	8951	
## 13:	0	0	0	5711	5711	5711	5711	5711	5711	5711	5711	
## 14:	0	0	0	8783	8783	8783	8783	8783	8783	8783	8783	
## 15:	0	0	0	3031	8347	0	8347	8347	8347	8347	8347	
## 16:	0	0	0	76	8759	0	0	8759	8759	8759	8759	
## 17:	0	0	0	48	8759	0	0	8759	8759	8759	8759	
## 18:	0	0	0	45	8758	0	0	8758	8758	8758	8758	
## 19:	0	0	0	14	8760	0	0	8760	8760	8760	8760	
## 20:	0	0	0	39	8707	0	0	0	8707	8707	8707	
## 21:	0	0	0	2649	8722	0	0	0	8722	8722	8722	
## 22:	8694	0	0	4347	8694	8694	0	0	0	0	0	
## 23:	8745	0	0	85	8745	8745	0	0	0	0	0	
## 24:	8732	0	0	2727	8732	8732	0	0	0	0	0	
## 25:	7844	0	0	4	7844	7844	0	0	0	0	0	
## 26:	8746	0	0	9	8746	8746	0	0	0	0	0	
## 27:	4409	0	0	4	4409	4409	0	0	0	0	0	
## 28:	8209	0	0	7	8209	8209	0	0	0	0	0	
## 29:	8753	0	0	5592	8753	8753	0	0	0	0	0	
## 30:	8749	0	0	2076	8749	8749	0	0	0	0	0	
## 31:	8695	0	0	3440	8695	8695	0	0	0	0	0	
## 32:	8696	0	0	8696	8696	8696	0	0	0	0	0	
## 33:	8660	0	0	2723	8660	8660	0	0	0	0	0	
## 34:	8613	0	0	221	8613	8613	0	0	0	0	0	
## 35:	16103	0	0	12	16103	16103	0	0	0	0	0	

```
## 36: 51563      0      0 27385 51563 51563      0      0      0      0      0
## 37: 52529      0      0 52529 52529 52529      0      0      0      0      0
## 38: 52480      0      0 21669 52480 52480      0      0      0      0      0
##      BAR  ATMP  WTMP  DEWP   VIS  YYYY  TIDE   mm   #YY  WDIR  PRES
```

```
library(ggplot2)
ggplot(missing_by_year, aes(x = Year)) +
  geom_line(aes(y = WDIR, color = "WDIR")) +
  geom_line(aes(y = WSPD, color = "WSPD")) +
  labs(y = "Number of Missing Values", x = "Year", title = "Missing Data Patterns by Year") +
  theme_minimal()
```



#Changing 99 or 999 is not always right since there may be some extreme condition which drive the value
#The pattern is that most of the missing value will be detected when time passed, and the most possible

3. To showing the climate change, I prefer to use the water temperature(WTMP), the air temperature(ATMP), the wind speed(WSPD), the biometric pressure(BAR), Wave height(WVHT), Average Wave period(APD), Visibility(VIS). I will first calculate the yearly average value of these factors and create a linear rgression line for them to show the transformation clearly. Also, I use a line graph to show the changes.

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

```
##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:data.table':
##
##      between, first, last
```

```

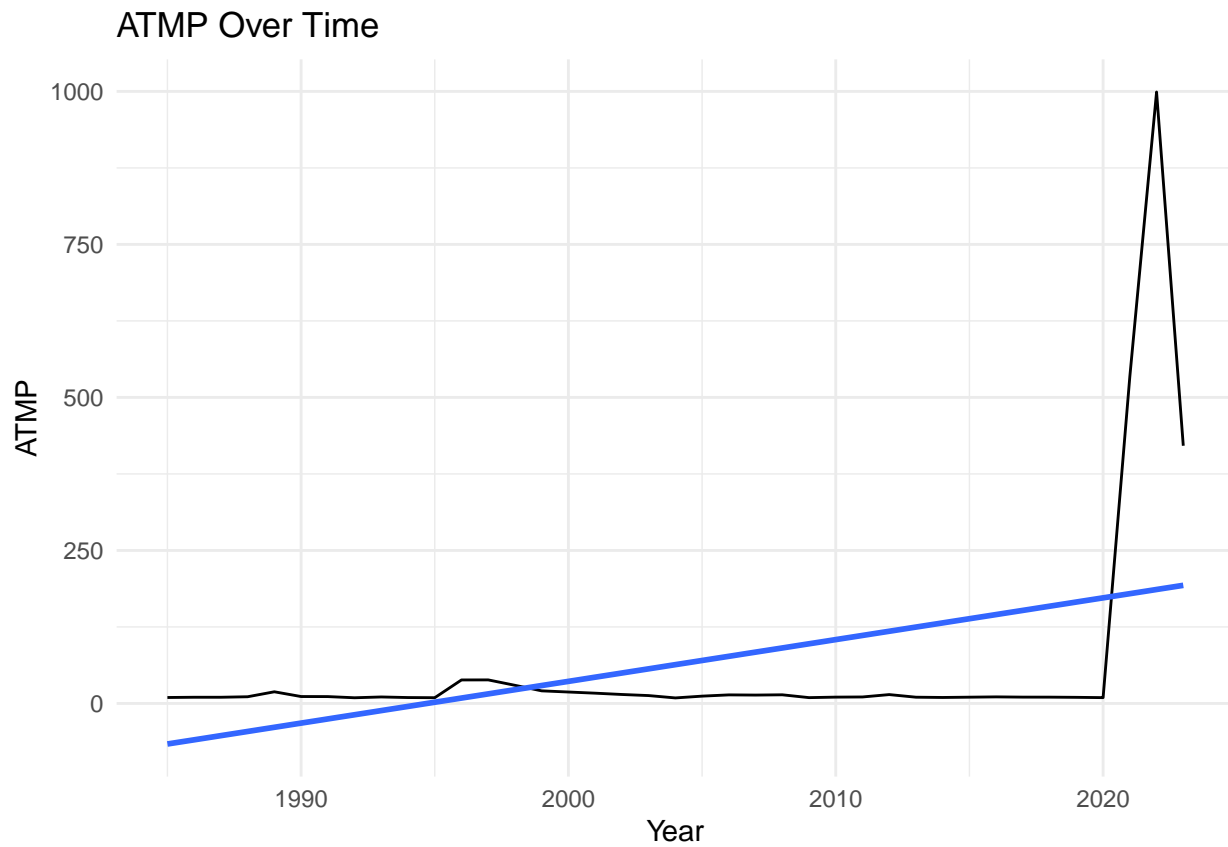
## The following objects are masked from 'package:stats':
##
##   filter, lag
## The following objects are masked from 'package:base':
##
##   intersect, setdiff, setequal, union

yearly_trends <- combined_data %>%
  group_by(Year) %>%
  summarise(
    avg_ATMP = mean(ATMP, na.rm = TRUE),
    avg_WTMP = mean(WTMP, na.rm = TRUE),
    avg_PRES = mean(PRES, na.rm = TRUE),
    avg_WSPD = mean(WSPD, na.rm = TRUE),
    avg_BAR = mean(BAR, na.rm = TRUE),
    avg_VIS = mean(VIS, na.rm = TRUE),
    avg_WVHT = mean(WVHT, na.rm = TRUE),
    avg_APD = mean(APD, na.rm = TRUE)
  )

ggplot(yearly_trends, aes(x = Year, y = avg_ATMP)) +
  geom_line() +
  geom_smooth(method = "lm", se = FALSE) +
  labs(title = "ATMP Over Time",
       x = "Year",
       y = "ATMP") +
  theme_minimal()

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

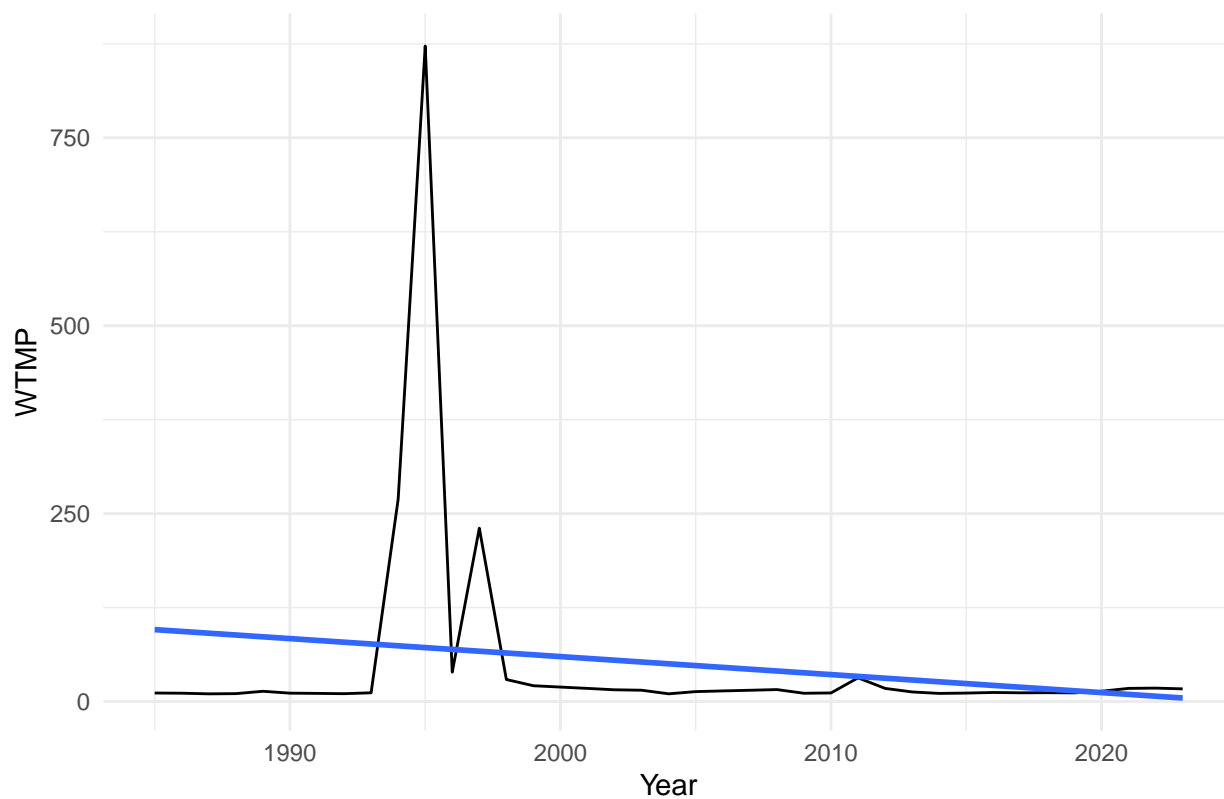
```



```
ggplot(yearly_trends, aes(x = Year, y = avg_WTMP)) +  
  geom_line() +  
  geom_smooth(method = "lm", se = FALSE) +  
  labs(title = "WTMP Over Time",  
        x = "Year",  
        y = "WTMP") +  
  theme_minimal()
```

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


WTMP Over Time



```
ggplot(yearly_trends, aes(x = Year, y = avg_PRES)) +
  geom_line() +
  geom_smooth(method = "lm", se = FALSE) +
  labs(title = "PRES Over Time",
        x = "Year",
        y = "PRES") +
  theme_minimal()
```

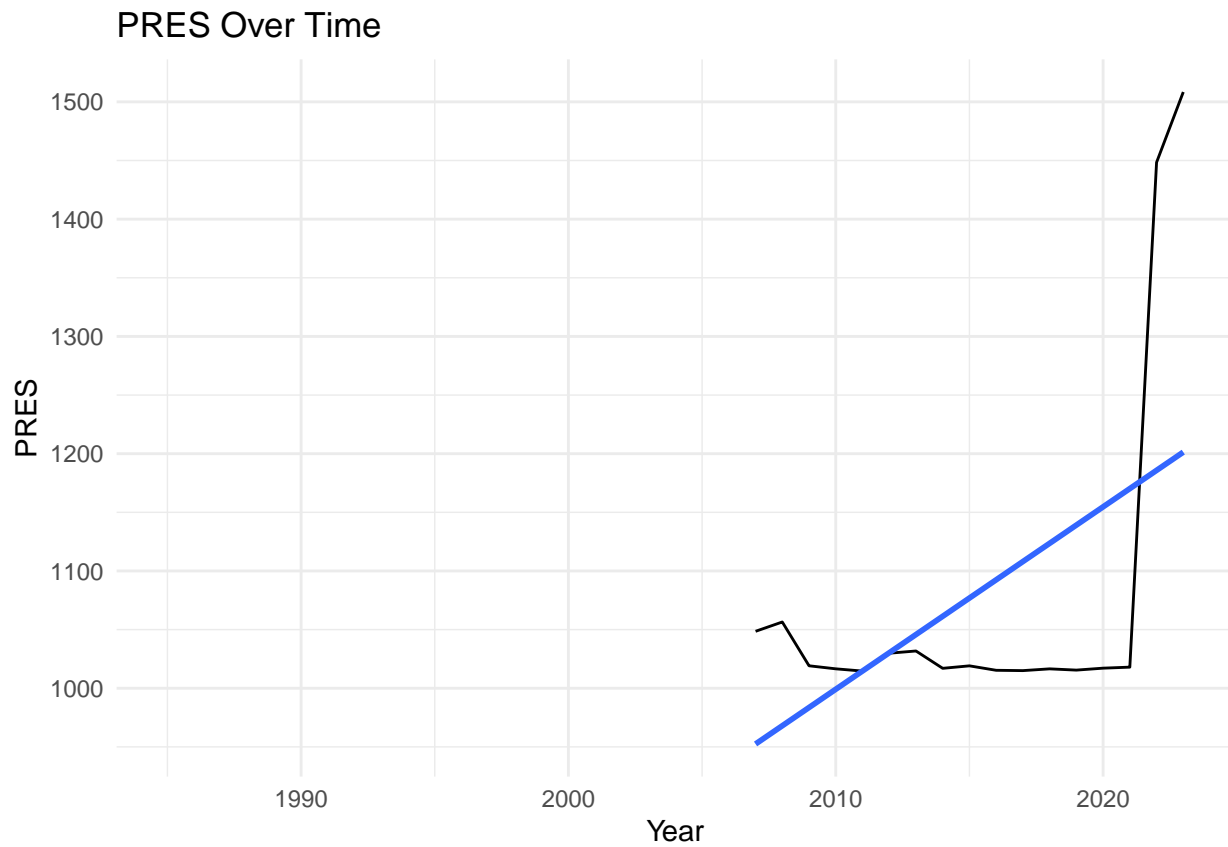
```
## `geom_smooth()` using formula = 'y ~ x'
```

```
## Warning: Removed 21 rows containing non-finite outside the scale range
```

```
## (`stat_smooth()`).
```

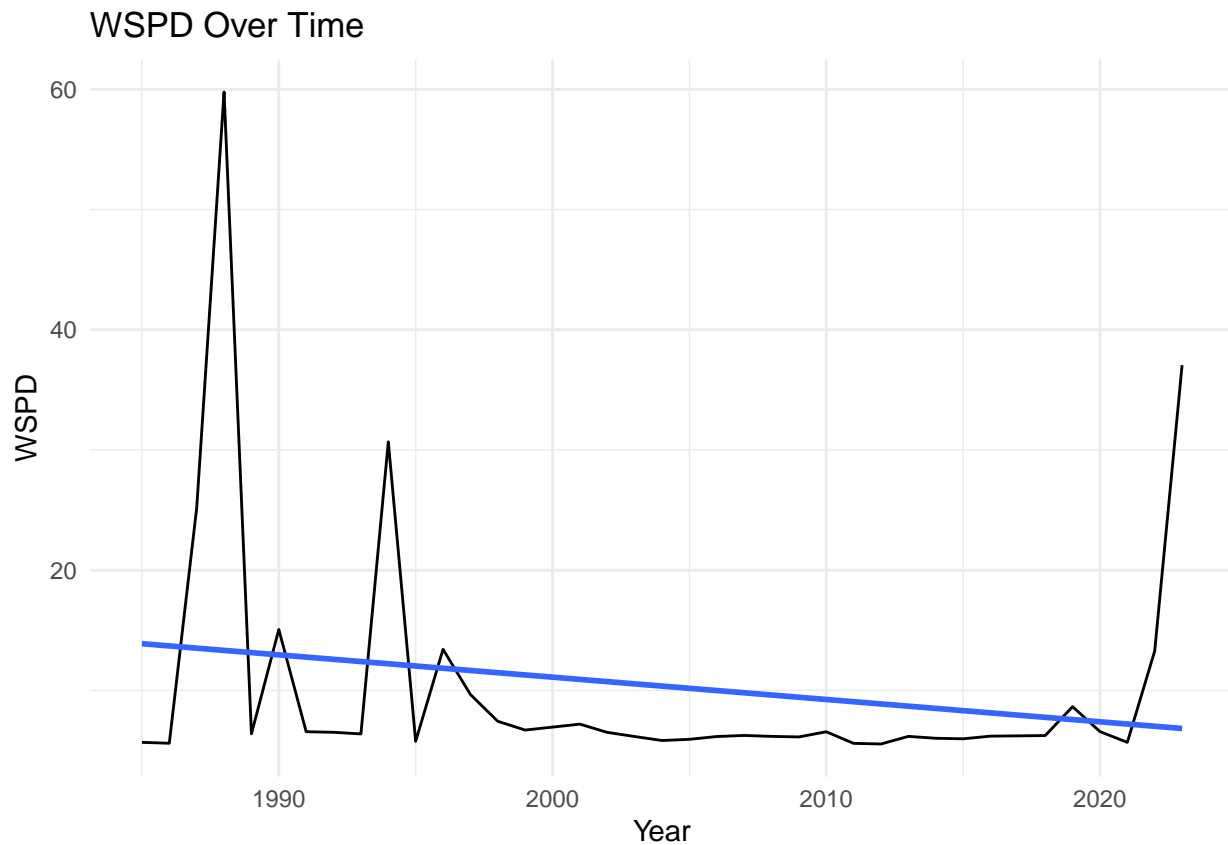
```
## Warning: Removed 21 rows containing missing values or values outside the scale range
```

```
## (`geom_line()`).
```



```
ggplot(yearly_trends, aes(x = Year, y = avg_WSPD)) +  
  geom_line() +  
  geom_smooth(method = "lm", se = FALSE) +  
  labs(title = "WSPD Over Time",  
        x = "Year",  
        y = "WSPD") +  
  theme_minimal()
```

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



```
ggplot(yearly_trends, aes(x = Year, y = avg_BAR)) +  
  geom_line() +  
  geom_smooth(method = "lm", se = FALSE) +  
  labs(title = "BAR Over Time",  
        x = "Year",  
        y = "BAR") +  
  theme_minimal()
```

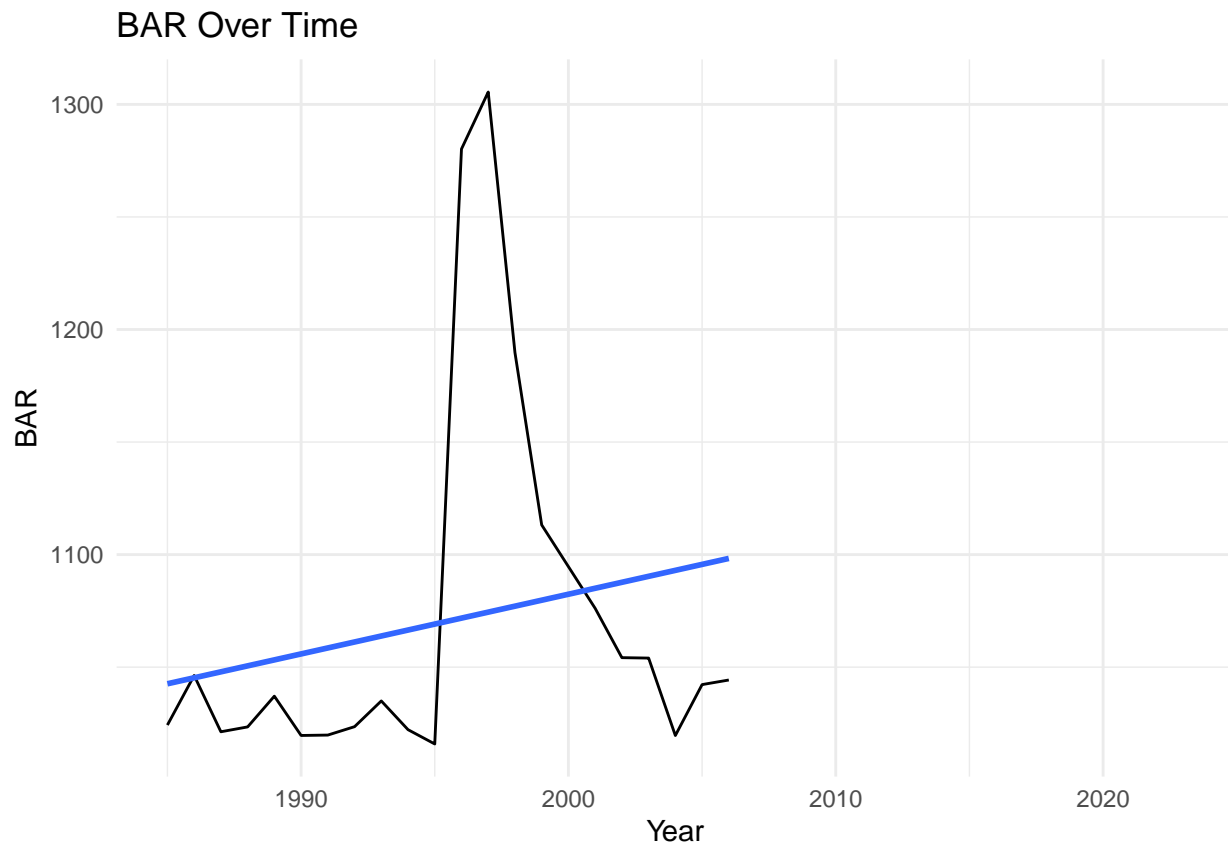
```
## `geom_smooth()` using formula = 'y ~ x'
```

```
## Warning: Removed 17 rows containing non-finite outside the scale range
```

```
## (`stat_smooth()`).
```

```
## Warning: Removed 17 rows containing missing values or values outside the scale range
```

```
## (`geom_line()`).
```



```
ggplot(yearly_trends, aes(x = Year, y = avg_VIS)) +
  geom_line() +
  geom_smooth(method = "lm", se = FALSE) +
  labs(title = "VIS Over Time",
        x = "Year",
        y = "VIS") +
  theme_minimal()
```

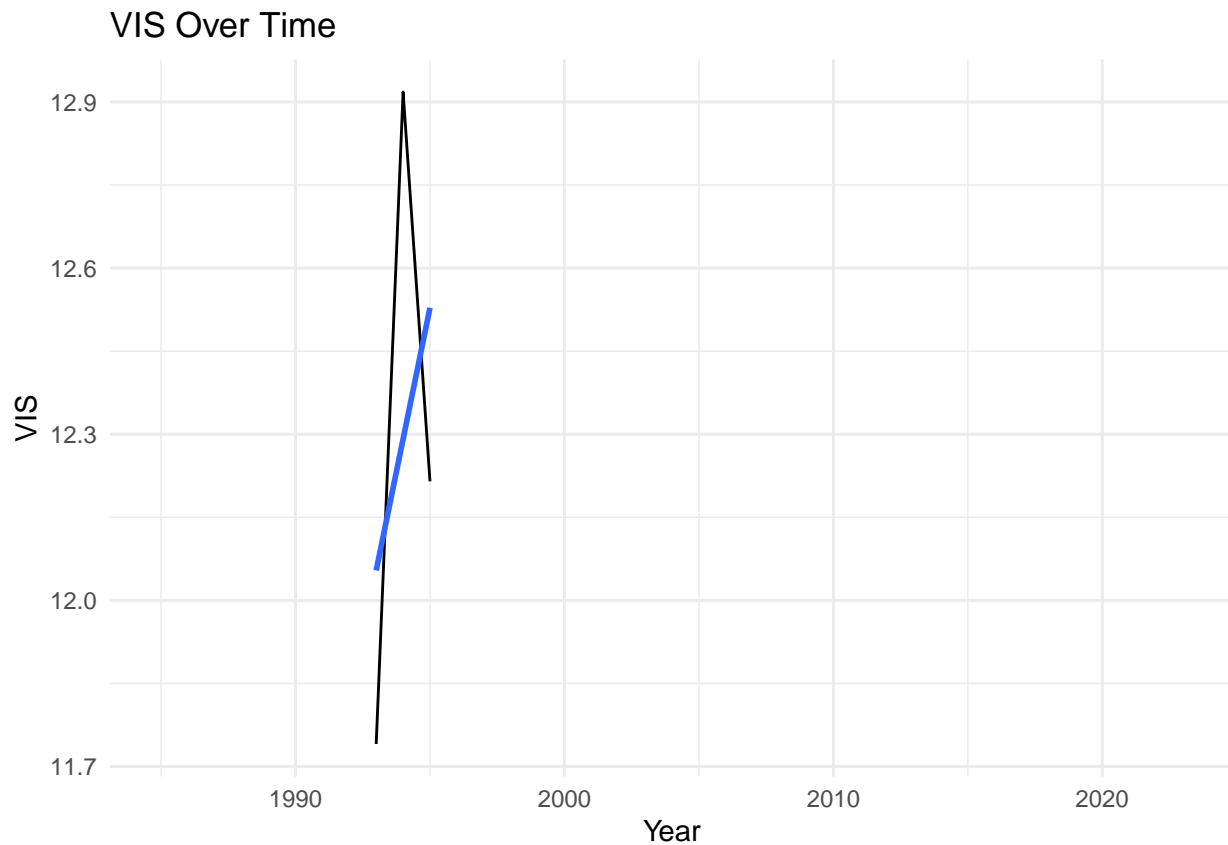
```
## `geom_smooth()` using formula = 'y ~ x'
```

```
## Warning: Removed 35 rows containing non-finite outside the scale range
```

```
## (`stat_smooth()`).
```

```
## Warning: Removed 35 rows containing missing values or values outside the scale range
```

```
## (`geom_line()`).
```



```
ggplot(yearly_trends, aes(x = Year, y = avg_WVHT)) +  
  geom_line() +  
  geom_smooth(method = "lm", se = FALSE) +  
  labs(title = "WVHT Over Time",  
        x = "Year",  
        y = "WVHT") +  
  theme_minimal()
```

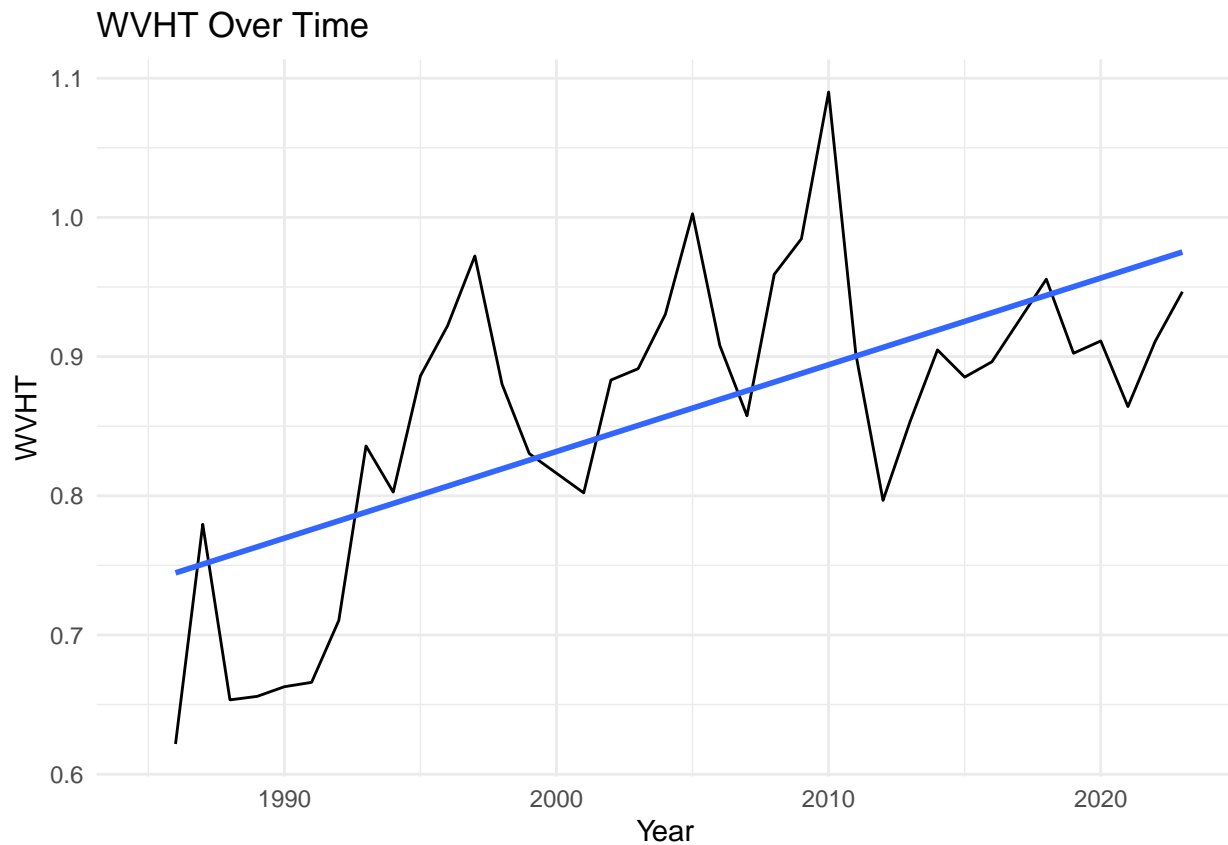
```
## `geom_smooth()` using formula = 'y ~ x'
```

```
## Warning: Removed 1 row containing non-finite outside the scale range
```

```
## (`stat_smooth()`).
```

```
## Warning: Removed 1 row containing missing values or values outside the scale range
```

```
## (`geom_line()`).
```



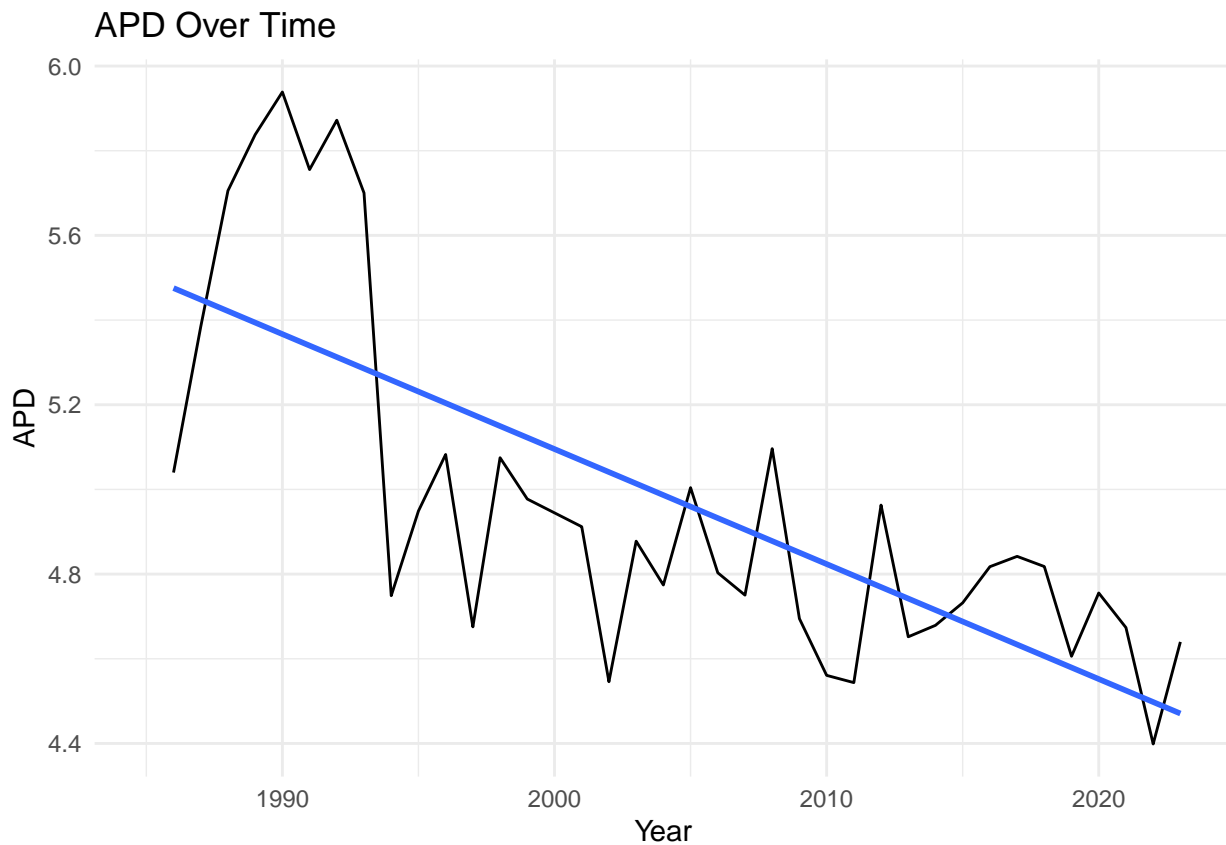
```
ggplot(yearly_trends, aes(x = Year, y = avg_APD)) +
  geom_line() +
  geom_smooth(method = "lm", se = FALSE) +
  labs(title = "APD Over Time",
        x = "Year",
        y = "APD") +
  theme_minimal()
```

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

```
## Warning: Removed 1 row containing non-finite outside the scale range (`stat_smooth()`).
```

```
## Removed 1 row containing missing values or values outside the scale range
```

```
## (`geom_line()`).
```



4.

The first bracket will answer two first two steps, summary the rainfall data and make a visualization of yearly data.

```
raindata <- read.csv("RainFall.csv")
head(raindata)
```

```
##      STATION      STATION_NAME      DATE HPCP
## 1 COOP:190770 BOSTON LOGAN INTERNATIONAL AIRPORT MA US 19850101 01:00 0.00
## 2 COOP:190770 BOSTON LOGAN INTERNATIONAL AIRPORT MA US 19850101 09:00 0.01
## 3 COOP:190770 BOSTON LOGAN INTERNATIONAL AIRPORT MA US 19850101 10:00 0.01
## 4 COOP:190770 BOSTON LOGAN INTERNATIONAL AIRPORT MA US 19850101 11:00 0.01
## 5 COOP:190770 BOSTON LOGAN INTERNATIONAL AIRPORT MA US 19850101 12:00 0.01
## 6 COOP:190770 BOSTON LOGAN INTERNATIONAL AIRPORT MA US 19850101 13:00 0.01
## Measurement.Flag Quality.Flag
## 1                g          NA
## 2                g          NA
## 3                g          NA
## 4                g          NA
## 5                g          NA
## 6                g          NA
```

#Calculating the yearly data of rainfall and make a visualization.

```
raindata <- raindata %>%
  mutate(DATE = as.POSIXct(DATE, format = "%Y%m%d %H:%M"),
         Year = as.numeric(format(DATE, "%Y")))

yearly_rainfall <- raindata %>%
  group_by(Year) %>%
```

```

summarise(total_rainfall = sum(HPCP, na.rm = TRUE)) %>%
  arrange(Year)

ggplot(yearly_rainfall, aes(x = Year, y = total_rainfall)) +
  geom_point()+
  geom_line()+
  theme(
    axis.text.x = element_text(angle = 45, hjust = 1)
  )

```

```

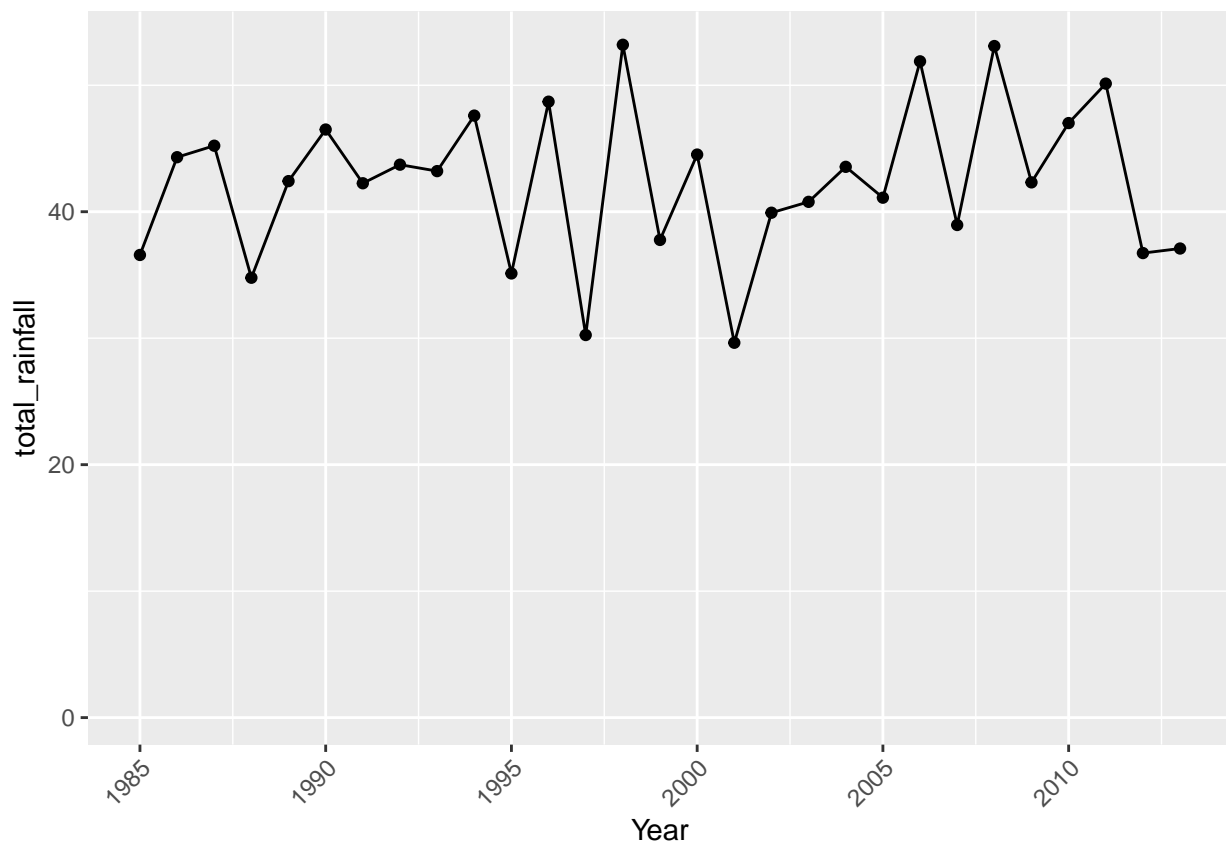
## Warning: Removed 1 row containing missing values or values outside the scale range
## (`geom_point()`).

```

```

## Warning: Removed 1 row containing missing values or values outside the scale range
## (`geom_line()`).

```



```
summary(yearly_rainfall)
```

```

##      Year      total_rainfall
##  Min.   :1985   Min.       : 0.50
## 1st Qu.:1992   1st Qu.:37.26
##  Median :1999   Median :42.37
##   Mean  :1999   Mean    :40.96
## 3rd Qu.:2006   3rd Qu.:46.18
##   Max.  :2013   Max.     :53.20
##   NA's  :1

```

The second bracket will create a simple model


```
head(combined_data)
```

```
##      YY      MM      DD      hh      WD      WSPD      GST      WVHT      DPD      APD      MWD      BAR
##      <int> <int> <int> <int> <int> <num> <num> <num> <num> <num> <int> <num>
## 1:    85      1      1      1      80      4      5      NA      NA      NA      NA 1030.0
## 2:    85      1      1      2     100      4      5      NA      NA      NA      NA 1030.1
## 3:    85      1      1      3     100      4      5      NA      NA      NA      NA 1029.4
## 4:    85      1      1      4     110      4      5      NA      NA      NA      NA 1028.6
## 5:    85      1      1      5      90      4      5      NA      NA      NA      NA 1027.8
## 6:    85      1      1      6      60      4      6      NA      NA      NA      NA 1027.7
##      ATMP      WTMP      DEWP      VIS      Year      YYYY      TIDE      mm      #YY      WDIR      PRES
##      <num> <num> <num> <num> <int> <int> <num> <int> <int> <int> <num>
## 1:    5.1    6.7      NA      NA 1985      NA      NA      NA      NA      NA      NA
## 2:    5.6    6.6      NA      NA 1985      NA      NA      NA      NA      NA      NA
## 3:    5.8    6.7      NA      NA 1985      NA      NA      NA      NA      NA      NA
## 4:    5.8    6.7      NA      NA 1985      NA      NA      NA      NA      NA      NA
## 5:    5.3    6.7      NA      NA 1985      NA      NA      NA      NA      NA      NA
## 6:    5.5    6.7      NA      NA 1985      NA      NA      NA      NA      NA      NA
```

```
yearly_data <- merge(yearly_rainfall, yearly_trends, by = "Year")
simple_model <- lm(total_rainfall ~ avg_ATMP + avg_WSPD + avg_PRES + avg_WVHT+avg_APD, data = yearly_data)
summary(simple_model)
```

```
##
## Call:
## lm(formula = total_rainfall ~ avg_ATMP + avg_WSPD + avg_PRES +
##      avg_WVHT + avg_APD, data = yearly_data)
##
## Residuals:
##      22      23      24      25      26      27      28
## -1.5089  0.7234 -2.1951  0.8707  0.3950  0.1399  1.5749
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) -432.1658   166.7007  -2.592    0.234
## avg_ATMP      -0.4675     1.3403   -0.349    0.786
## avg_WSPD     -28.8579     8.2997   -3.477    0.178
## avg_PRES       0.6284     0.2240    2.805    0.218
## avg_WVHT     124.1227    26.9713    4.602    0.136
## avg_APD     -22.2693    14.7372   -1.511    0.372
##
## Residual standard error: 3.321 on 1 degrees of freedom
## (21 observations deleted due to missingness)
## Multiple R-squared:  0.9571, Adjusted R-squared:  0.7428
## F-statistic: 4.465 on 5 and 1 DF, p-value: 0.344
```