climate data - San Francisco

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Temperature Changes in San Francisco

##

##

\$ SNWD

\$ TAVG

\$ TMIN

TMAX

: int

San Francisco temperature changes since 1921 cannot be attributed to becoming a heat island, as it has been developed for over a century

```
developed for over a century
#file.choose()
\#read.csv("/home/CAMPUS/achb2017/Climate\_Change\_Narratives/student\_folders/Hsu/AllieHsu\_SanFrancisco\_Datasetalores
climate_data <- read.csv("/home/CAMPUS/achb2017/Climate_Change_Narratives/student_folders/Hsu/AllieHsu_</pre>
head(climate_data)
##
         STATION
                                             NAME
                                                       DATE DAPR MDPR PRCP PSUN
## 1 USW00023272 SAN FRANCISCO DOWNTOWN, CA US 7/1/1921
                                                              NA
                                                                    NA
                                                                          0
                                                                              NA
## 2 USW00023272 SAN FRANCISCO DOWNTOWN, CA US 7/2/1921
                                                              NA
                                                                    NA
                                                                          0
                                                                              NA
## 3 USW00023272 SAN FRANCISCO DOWNTOWN, CA US 7/3/1921
                                                              NA
                                                                    NA
                                                                          0
                                                                              NA
## 4 USW00023272 SAN FRANCISCO DOWNTOWN, CA US 7/4/1921
                                                                    NA
                                                                              NA
## 5 USW00023272 SAN FRANCISCO DOWNTOWN, CA US 7/5/1921
                                                              NA
                                                                    NA
                                                                          0
                                                                              NA
   6 USW00023272 SAN FRANCISCO DOWNTOWN, CA US 7/6/1921
                                                              NA
                                                                    NA
                                                                              NA
     SNOW SNWD TAVG TMAX TMIN TOBS TSUN WDFM WSF1 WSFG WSFM WTO1 WTO3 WTO4
##
## 1
        0
             NA
                       76
                             54
                                  NA
                  NA
                                        NA
                                             NA
                                                  NA
                                                        NA
                                                             NA
                                                                   NA
                                                                        NA
                                                                             NA
## 2
        0
             NA
                  NA
                       85
                             60
                                  NA
                                        NA
                                             NA
                                                  NA
                                                        NA
                                                             NA
                                                                   NA
                                                                        NA
                                                                             NA
        0
                                                                        NA
## 3
             NA
                  NA
                       85
                             62
                                  NA
                                        NA
                                             NA
                                                  NA
                                                        NA
                                                             NA
                                                                   NA
                                                                             NA
## 4
        0
             NA
                  NA
                       64
                             53
                                  NA
                                        NA
                                             NA
                                                  NA
                                                        NA
                                                             NA
                                                                   NA
                                                                        NA
                                                                             NA
## 5
        0
             NA
                  NA
                       82
                             52
                                  NA
                                        NA
                                             NA
                                                  NA
                                                        NA
                                                             NA
                                                                  NA
                                                                        NA
                                                                             NA
##
  6
        0
             NA
                  NA
                       94
                             61
                                  NA
                                        NA
                                             NA
                                                  NA
                                                        NA
                                                             NA
                                                                  NA
                                                                        NA
                                                                             NA
##
     WT05 WT08 WT11 WT16 WT18
## 1
       NA
             NA
                  NA
                       NA
                             NA
## 2
                       NA
       NA
             NA
                  NA
                             NΑ
## 3
       NA
             NA
                  NA
                       NA
                             NA
## 4
       NA
                       NA
             NA
                  NA
                             NΑ
## 5
       NA
             NA
                  NA
                       NA
                             NA
       NA
                  NA
                       NA
                             NA
## 6
             NΑ
str(climate_data)
   'data.frame':
                     35930 obs. of 26 variables:
##
    $ STATION: Factor w/ 1 level "USW00023272": 1 1 1 1 1 1 1 1 1 1 1 ...
    $ NAME
             : Factor w/ 1 level "SAN FRANCISCO DOWNTOWN, CA US": 1 1 1 1 1 1 1 1 1 1 1 1 . . .
              : Factor w/ 35930 levels "1/1/1922","1/1/1923",...: 26823 27912 29001 29298 29397 29496 295
##
    $ DATE
    $ DAPR
             : int NA ...
##
             : num NA NA NA NA NA NA NA NA NA ...
##
    $ MDPR
##
    $ PRCP
             : num
                     0 0 0 0 0 0 0 0 0 0 ...
##
    $ PSUN
                     NA NA NA NA NA NA NA NA NA ...
             : int
    $ SNOW
                     0 0 0 0 0 0 0 0 0 0 ...
##
             : num
```

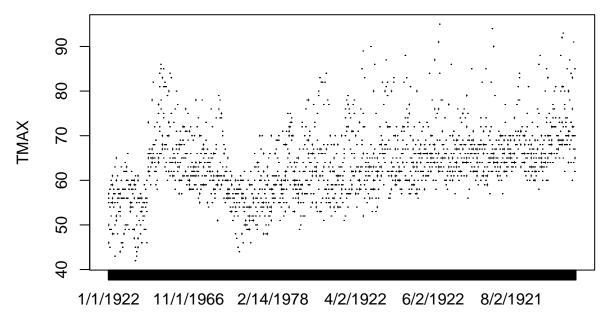
NA NA NA NA NA NA NA NA NA ...

76 85 85 64 82 94 90 79 64 60 ...

: int NA NA NA NA NA NA NA NA NA ...

: int 54 60 62 53 52 61 61 56 54 52 ...

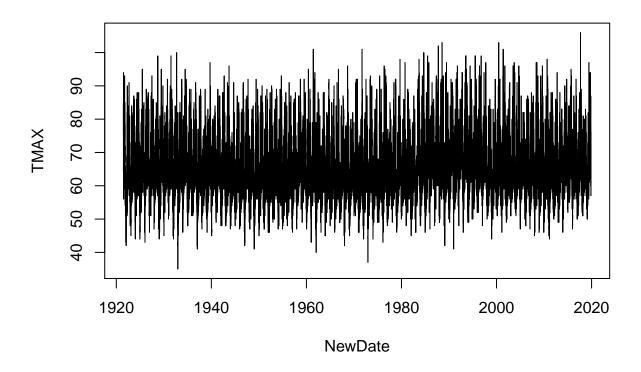
```
$ TOBS
           : int NA ...
##
   $ TSUN
           : int NA ...
##
  $ WDFM
           : int NA NA NA NA NA NA NA NA NA ...
           : num NA ...
##
  $ WSF1
##
   $ WSFG
           : num NA NA NA NA NA NA NA NA NA ...
  $ WSFM
##
           : num NA NA NA NA NA NA NA NA NA ...
           : int NA ...
  $ WT01
           : int NA ...
   $ WTO3
##
           : int NA ...
##
   $ WTO4
## $ WT05
           : int NA ...
## $ WT08
           : int NA ...
            : int NA ...
##
   $ WT11
           : int NA ...
   $ WT16
           : int NA ...
   $ WT18
names(climate_data)
                                                                   "PSUN"
##
   [1] "STATION" "NAME"
                           "DATE"
                                     "DAPR"
                                               "MDPR"
                                                         "PRCP"
##
   [8] "SNOW"
                 "SNWD"
                           "TAVG"
                                     "TMAX"
                                               "TMIN"
                                                         "TOBS"
                                                                   "TSUN"
## [15] "WDFM"
                  "WSF1"
                           "WSFG"
                                     "WSFM"
                                               "WT01"
                                                         "WT03"
                                                                   "WT04"
                 "80TW"
                           "WT11"
## [22] "WT05"
                                     "WT16"
                                               "WT18"
## plot(TMAX~DATE, climate_data)
min(climate_data$TMAX)
## [1] NA
min(climate_data$TMAX, na.rm = T)
## [1] 35
climate_data$TMAX[climate_data$TMAX==-9999] = NA
climate_data$TMIN[climate_data$TMIN==-9999] = NA ## eliminating placeholders which will skew our average
plot(TMAX~DATE, climate_data[1:1835,], ty='1')
```



DATE

```
str(climate data)
                   35930 obs. of 26 variables:
   'data.frame':
   $ STATION: Factor w/ 1 level "USW00023272": 1 1 1 1 1 1 1 1 1 1 1 ...
   $ NAME
            : Factor w/ 1 level "SAN FRANCISCO DOWNTOWN, CA US": 1 1 1 1 1 1 1 1 1 1 1 ...
   $ DATE
            : Factor w/ 35930 levels "1/1/1922","1/1/1923",...: 26823 27912 29001 29298 29397 29496 295
##
   $ DAPR
           : int NA ...
   $ MDPR
                   NA NA NA NA NA NA NA NA NA ...
##
            : num
                   0 0 0 0 0 0 0 0 0 0 ...
##
   $ PRCP
            : num
                  NA NA NA NA NA NA NA NA NA ...
   $ PSUN
           : int
##
                   0 0 0 0 0 0 0 0 0 0 ...
   $ SNOW
            : num
##
   $ SNWD
            : int
                   NA NA NA NA NA NA NA NA NA ...
##
   $ TAVG
                   NA NA NA NA NA NA NA NA NA ...
            : int
                   76 85 85 64 82 94 90 79 64 60 ...
##
   $ TMAX
            : int
   $ TMIN
            : int
                   54 60 62 53 52 61 61 56 54 52 ...
##
           : int
##
   $ TOBS
                   NA NA NA NA NA NA NA NA NA ...
                   NA NA NA NA NA NA NA NA NA ...
##
   $ TSUN
            : int
##
   $ WDFM
            : int
                   NA NA NA NA NA NA NA NA NA ...
##
     WSF1
                   NA NA NA NA NA NA NA NA NA ...
            : num
                   NA NA NA NA NA NA NA NA NA ...
##
   $ WSFG
            : num
##
                   NA NA NA NA NA NA NA NA NA ...
            : num
##
   $ WT01
            : int
                   NA NA NA NA NA NA NA NA NA ...
##
   $ WT03
            : int
                   NA NA NA NA NA NA NA NA NA ...
                   NA NA NA NA NA NA NA NA NA ...
##
   $ WT04
            : int
            : int NA NA NA NA NA NA NA NA NA ...
   $ WT05
            : int NA NA NA NA NA NA NA NA NA ...
   $ WT08
```

```
## $ WT11 : int NA ...
## $ WT16 : int NA ...
## $ WT18 : int NA ...
strDates <- as.character(climate_data$DATE)
climate_data$NewDate <- as.Date(strDates, "%m/%d/%Y") ##reformatting dates - NewDate
plot(TMAX~NewDate, climate_data, ty='l') ## plot of daily TMAX data</pre>
```



Analyse Climate Data

null hypothesis = slope of best fit line is zero, y-intercept is zero

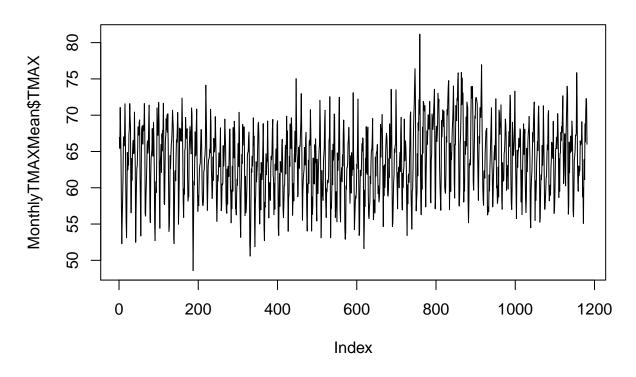
```
lm(TMAX ~ NewDate, data=climate_data)

##
## Call:
## lm(formula = TMAX ~ NewDate, data = climate_data)
##
## Coefficients:
## (Intercept) NewDate
## 6.372e+01 5.835e-05

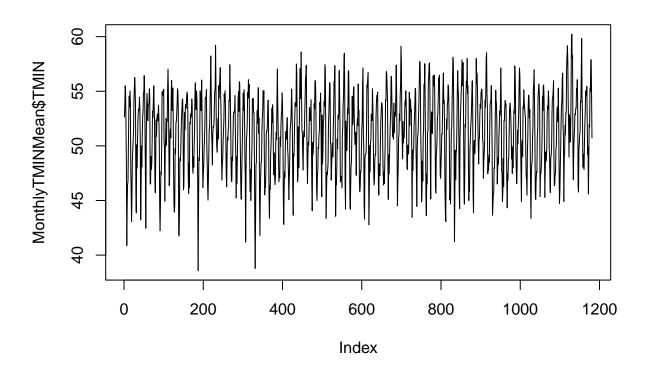
summary(lm(TMAX ~ NewDate, data=climate_data))

##
## Call:
```

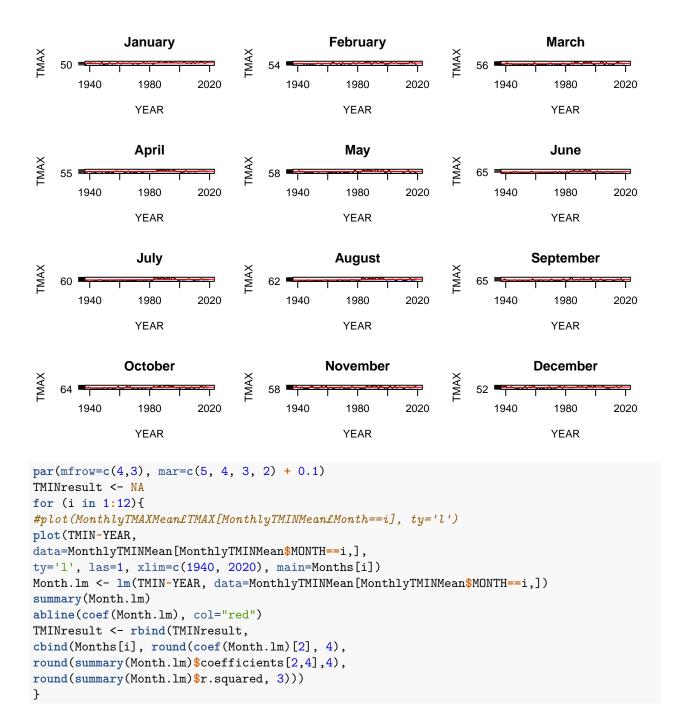
```
## lm(formula = TMAX ~ NewDate, data = climate_data)
##
## Residuals:
##
               1Q Median
                               3Q
      Min
                                      Max
## -27.929 -4.935 -0.867 3.795 41.265
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 6.372e+01 4.010e-02 1588.8 <2e-16 ***
           5.835e-05 3.865e-06
## NewDate
                                      15.1
                                             <2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 7.6 on 35926 degrees of freedom
    (2 observations deleted due to missingness)
## Multiple R-squared: 0.006303, Adjusted R-squared: 0.006275
## F-statistic: 227.9 on 1 and 35926 DF, p-value: < 2.2e-16
## slightly positive temperature slope (5.835e-05) - highly significant (2e-16 - is much less than 0.05
## lots of variability, not date driven
we reject the null hypothesis!
## disaggregate into month and year variables
climate_data$Month = format(as.Date(climate_data$NewDate), format = "%m")
climate_data$Year = format(climate_data$NewDate, format="%Y")
MonthlyTMAXMean = aggregate(TMAX ~ Month + Year, climate_data, mean)
MonthlyTMAXMean$YEAR = as.numeric(MonthlyTMAXMean$Year)
MonthlyTMAXMean$MONTH = as.numeric(MonthlyTMAXMean$Month)
str(MonthlyTMAXMean)
## 'data.frame':
                 1181 obs. of 5 variables:
## $ Month: chr "07" "08" "09" "10" ...
## $ Year : chr "1921" "1921" "1921" "1921" ...
## $ TMAX : num 66.9 65.4 71.1 68.1 64.1 ...
## $ YEAR : num 1921 1921 1921 1921 ...
## $ MONTH: num 7 8 9 10 11 12 1 2 3 4 ...
plot(MonthlyTMAXMean$TMAX, ty='l')
```

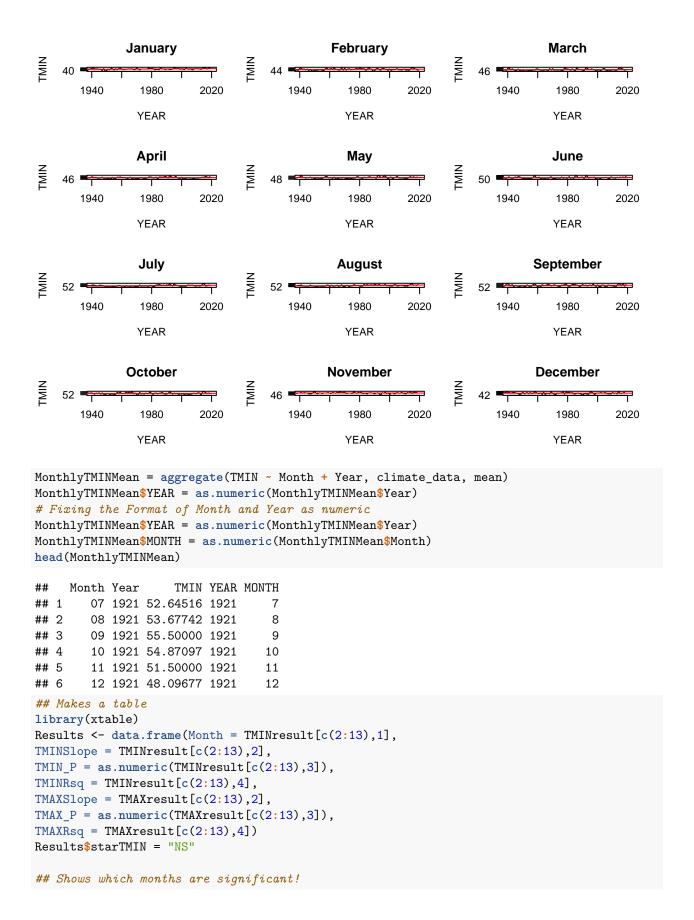


```
MonthlyTMINMean = aggregate(TMIN ~ Month + Year, climate_data, mean)
MonthlyTMINMean$YEAR = as.numeric(MonthlyTMINMean$Year)
MonthlyTMINMean$YEAR = as.numeric(MonthlyTMINMean$Year)
MonthlyTMINMean$MONTH = as.numeric(MonthlyTMINMean$Month)
head(MonthlyTMINMean)
##
     Month Year
                    TMIN YEAR MONTH
## 1
        07 1921 52.64516 1921
## 2
        08 1921 53.67742 1921
                                  8
        09 1921 55.50000 1921
                                  9
## 3
        10 1921 54.87097 1921
                                  10
##
## 5
        11 1921 51.50000 1921
                                  11
        12 1921 48.09677 1921
## 6
                                  12
plot(MonthlyTMINMean$TMIN, ty='1')
```



```
Months = c("January", "February", "March", "April", "May", "June",
"July", "August", "September", "October", "November", "December")
# Create a panel so I can see all the figures at once.
par(mfrow=c(4,3), mar=c(5, 4, 3, 2) + 0.1)
TMAXresult <- NA
for (i in 1:12){
\#plot(MonthlyTMAXMean\poundsTMAX[MonthlyTMAXMean\poundsMonth==i], ty='l')
plot(TMAX~YEAR,
data=MonthlyTMAXMean[MonthlyTMAXMean$MONTH==i,],
ty='1', las=1, xlim=c(1940, 2020), main=Months[i])
Month.lm <- lm(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$MONTH==i,])</pre>
summary(Month.lm)
abline(coef(Month.lm), col="red")
TMAXresult <- rbind(TMAXresult,</pre>
cbind(Months[i], round(coef(Month.lm)[2], 4),
round(summary(Month.lm)$coefficients[2,4],4),
round(summary(Month.lm)$r.squared, 3)))
}
```





```
Results$starTMIN[Results$TMIN_P <= .05] = "*"</pre>
Results$starTMIN[Results$TMIN_P < 0.01] = "**"</pre>
Results$starTMIN[Results$TMIN_P < 0.001] = "***"</pre>
Results$starTMAX = "NS"
Results$starTMAX[Results$TMAX_P < 0.05] = "*"</pre>
Results$starTMAX[Results$TMAX_P < 0.01] = "**"</pre>
Results$starTMAX[Results$TMAX_P < 0.001] = "***"</pre>
Results$TMINslope=paste(Results$TMINSlope, Results$starTMIN)
Results$TMAXslope=paste(Results$TMAXSlope, Results$starTMAX)
colnames(Results) <- c("Month", "2", "3", "R^2", "5", "6",</pre>
"R^2", "8", "9", "Slope TMIN", "Slope TMAX")
print(xtable(Results[,c(1, 10, 4, 11, 7)]))
## % latex table generated in R 3.6.0 by xtable 1.8-4 package
## % Fri Dec 6 14:45:24 2019
## \begin{table}[ht]
## \centering
## \begin{tabular}{rlllll}
##
     \hline
##
    & Month & Slope TMIN & R\verb|^|2 & Slope TMAX & R\verb|^|2.1 \\
##
     \hline
## 1 & January & 0.0301 *** & 0.122 & 0.0448 *** & 0.229 \\
##
     2 & February & 0.008 NS & 0.01 & 0.0229 * & 0.056 \\
##
     3 & March & 0.0035 NS & 0.003 & 0.0145 NS & 0.017 \
##
     4 & April & 0.0019 NS & 0.001 & 0.0151 NS & 0.02 \\
##
     5 & May & 1e-04 NS & 0 & 0.0061 NS & 0.004 \\
##
     6 & June & 0.0034 NS & 0.005 & 0.0188 NS & 0.036 \\
     7 & July & 0.0165 *** & 0.111 & 0.0264 ** & 0.075 \\
##
##
     8 & August & 0.0268 *** & 0.215 & 0.038 *** & 0.151 \\
##
     9 & September & 0.0095 NS & 0.027 & 0.0196 NS & 0.037 \
##
     10 & October & 0.0033 NS & 0.005 & 0.0208 * & 0.061 \\
     11 & November & -0.0017 NS & 0.001 & 0.0016 NS & 0 \\
##
     12 & December & 0.003 NS & 0.002 & 0.0222 * & 0.067 \\
##
##
      \hline
## \end{tabular}
## \end{table}
```

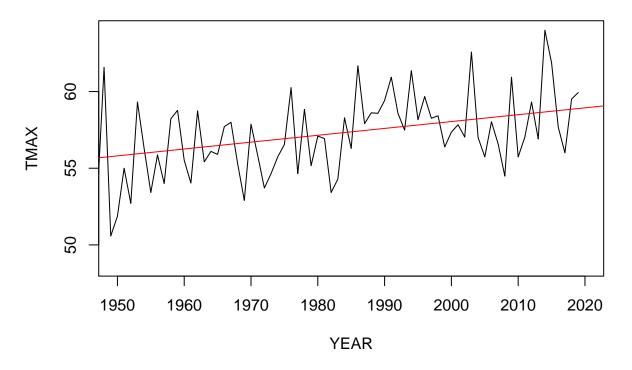
From here we see that the months January, July, and August see strong significance in the rise of both their minimum and maximum temperature. Feburary, October, and December also have significant changes in their minimum temperature.

```
## January
plot(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$Month=="01",],
ty='1', xlim=c(1950, 2020))
January.lm <- lm(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$Month=="01",])</pre>
summary(January.lm)
##
## lm(formula = TMAX ~ YEAR, data = MonthlyTMAXMean[MonthlyTMAXMean$Month ==
       "01", ])
##
##
## Residuals:
##
       Min
                                 3Q
```

Max

1Q Median

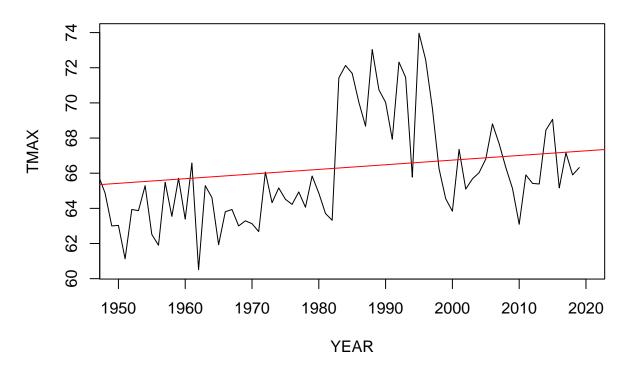
```
## -6.6428 -1.5843 -0.2245 1.5296 5.8649
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -31.473738
                         16.507514
                                    -1.907
## YEAR
                0.044758
                           0.008376
                                      5.343 6.14e-07 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.346 on 96 degrees of freedom
## Multiple R-squared: 0.2292, Adjusted R-squared: 0.2212
## F-statistic: 28.55 on 1 and 96 DF, p-value: 6.137e-07
abline(coef(January.lm), col="red")
```



```
## July
plot(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$Month=="07",],
ty='l', xlim=c(1950, 2020))
July.lm <- lm(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$Month=="07",])
summary(July.lm)

## Call:
## lm(formula = TMAX ~ YEAR, data = MonthlyTMAXMean[MonthlyTMAXMean$Month ==
## "07",])
##
## Residuals:</pre>
```

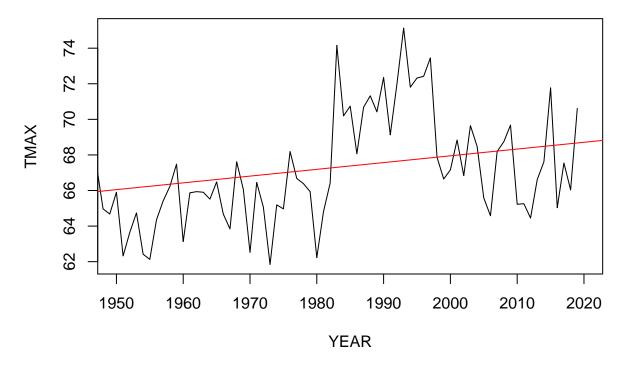
```
##
      Min
               10 Median
                               3Q
## -5.2249 -1.8191 -0.5002 1.4231
                                  7.3548
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 13.904058 18.587980
                                     0.748 0.45626
## YEAR
               0.026420
                          0.009435
                                     2.800 0.00616 **
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.683 on 97 degrees of freedom
## Multiple R-squared: 0.0748, Adjusted R-squared: 0.06526
## F-statistic: 7.842 on 1 and 97 DF, p-value: 0.00616
abline(coef(July.lm), col="red")
```



```
##August
plot(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$Month=="08",],
ty='l', xlim=c(1950, 2020))
August.lm <- lm(TMAX~YEAR, data=MonthlyTMAXMean[MonthlyTMAXMean$Month=="08",])
summary(August.lm)

##
## Call:
## lm(formula = TMAX ~ YEAR, data = MonthlyTMAXMean[MonthlyTMAXMean$Month ==
## "08",])
##</pre>
## "08",])
```

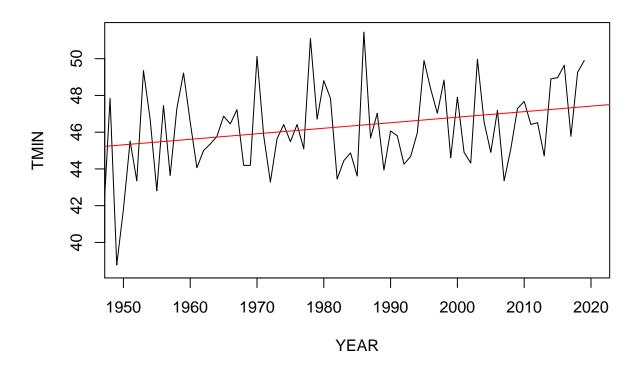
```
## Residuals:
##
       Min
                1Q Median
                               3Q
                                      Max
  -5.0847 -1.7490 -0.3958 1.5673 7.4454
##
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) -8.074746 18.004941 -0.448
                                    4.160 6.89e-05 ***
## YEAR
                0.038012
                          0.009139
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 2.598 on 97 degrees of freedom
## Multiple R-squared: 0.1514, Adjusted R-squared: 0.1426
## F-statistic: 17.3 on 1 and 97 DF, p-value: 6.893e-05
abline(coef(August.lm), col="red")
```



```
## January
plot(TMIN~YEAR, data=MonthlyTMINMean[MonthlyTMINMean$Month=="01",],
ty='l', xlim=c(1950, 2020))
January.lm <- lm(TMIN~YEAR, data=MonthlyTMINMean[MonthlyTMINMean$Month=="01",])
summary(January.lm)

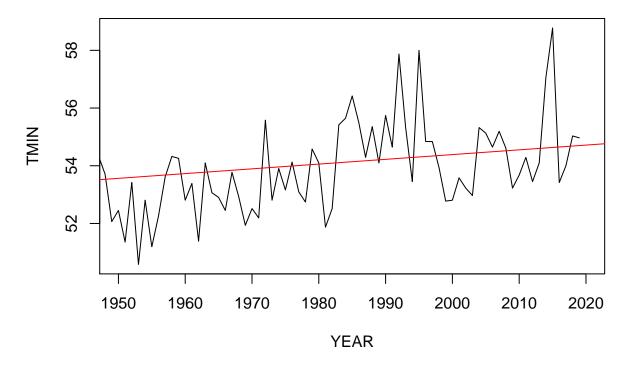
##
## Call:
## lm(formula = TMIN ~ YEAR, data = MonthlyTMINMean[MonthlyTMINMean$Month ==
## "01",])</pre>
```

```
##
## Residuals:
                1Q Median
##
       Min
                                       Max
  -6.5076 -1.8122 0.1856 1.6429
##
                                    5.0568
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
                           16.23815
                                    -0.822 0.413095
## (Intercept) -13.34830
## YEAR
                 0.03008
                            0.00824
                                      3.651 0.000425 ***
## ---
## Signif. codes:
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 2.307 on 96 degrees of freedom
## Multiple R-squared: 0.1219, Adjusted R-squared: 0.1128
## F-statistic: 13.33 on 1 and 96 DF, p-value: 0.0004255
abline(coef(January.lm), col="red")
```



```
## July
plot(TMIN~YEAR, data=MonthlyTMINMean[MonthlyTMINMean$Month=="07",],
ty='l', xlim=c(1950, 2020))
July.lm <- lm(TMIN~YEAR, data=MonthlyTMINMean[MonthlyTMINMean$Month=="07",])
summary(July.lm)
##
## Call:
## lm(formula = TMIN ~ YEAR, data = MonthlyTMINMean[MonthlyTMINMean$Month ==</pre>
```

```
"07", ])
##
##
## Residuals:
##
       Min
                1Q Median
                               ЗQ
                                       Max
##
   -3.0323 -0.9165 -0.0554 0.8423
                                    4.1406
##
## Coefficients:
                Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 21.461506
                          9.309211
                                      2.305 0.023274 *
## YEAR
                0.016463
                           0.004725
                                      3.484 0.000743 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 1.344 on 97 degrees of freedom
## Multiple R-squared: 0.1112, Adjusted R-squared: 0.1021
## F-statistic: 12.14 on 1 and 97 DF, p-value: 0.0007426
abline(coef(July.lm), col="red")
```



```
##August
plot(TMIN~YEAR, data=MonthlyTMINMean[MonthlyTMINMean$Month=="08",],
ty='l', xlim=c(1950, 2020))
August.lm <- lm(TMIN~YEAR, data=MonthlyTMINMean[MonthlyTMINMean$Month=="08",])
summary(August.lm)
##
## Call:</pre>
```

```
## lm(formula = TMIN ~ YEAR, data = MonthlyTMINMean[MonthlyTMINMean$Month ==
##
       "08", ])
##
## Residuals:
##
       Min
                1Q Median
                               ЗQ
                                      Max
##
  -3.7772 -1.0142 -0.0739 1.2758
                                   4.2278
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 2.000972 10.249707
                                      0.195
                                              0.846
                0.026798
                           0.005202
                                      5.151 1.36e-06 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
\#\# Residual standard error: 1.479 on 97 degrees of freedom
## Multiple R-squared: 0.2148, Adjusted R-squared: 0.2067
## F-statistic: 26.53 on 1 and 97 DF, p-value: 1.36e-06
abline(coef(August.lm), col="red")
```

