

Time Series HW 2

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September 9, 2016

```
## Allison's code

rawbozemadata <- read.csv("https://dl.dropboxusercontent.com/u/77307195/rawbozemadata.csv",
                          header = T)

library(dplyr, quietly = T)
library(zoo, quietly = T)

rawd <- tbl_df(rawbozemadata) %>%
  mutate(
    DATE = as.yearmon(as.character(DATE), "%Y%m")
  )

rawd2 <- mutate(
  rawd,
  YEAR = as.numeric(format(DATE, "%Y")),
  MONTH = as.factor(format(DATE, "%m"))
)

rawd2 <- mutate(
  rawd2,
  YEARFRAC = YEAR + (as.numeric(MONTH) - 1)/12
)

## Andrea's code

setwd("C:/Users/Andrea Mack/Desktop/mack_hub/course_work/Time Series/Homework/HW2")
rawbozemadata <- read.csv("rawbozemadata.csv", stringsAsFactors = FALSE)
rawd <- NULL
rawd <- data.frame(rawbozemadata)
rawd$year <- as.numeric(substring(rawd$DATE, 1,4))
rawd$month <- as.numeric(substring(rawd$DATE, 5,6))
rawd$month.dec <- rawd$month/12
rawd$date.new <- rawd$year + rawd$month.dec
rawd$month <- month.abb[as.numeric(rawd$month)]
rawd$temp <- rawd$MMXT
```

1.

The model using the linear time trend for year and month is:

$$\widehat{temp}_i = -69.2902 + 0.0517 \text{ Year}_i + 3.7058 \text{ I(February)} + 11.198 \text{ I(March)} + 21.9902 \text{ I(April)} + 31.2412 \text{ I(May)} + 39.7299 \text{ I(June)} + 49.5908 \text{ I(July)} + 48.496 \text{ I(August)} + 37.6638 \text{ I(September)} + 25.8609 \text{ I(October)} + 10.3582 \text{ I(November)} + 1.7802 \text{ I(December)}$$

2.

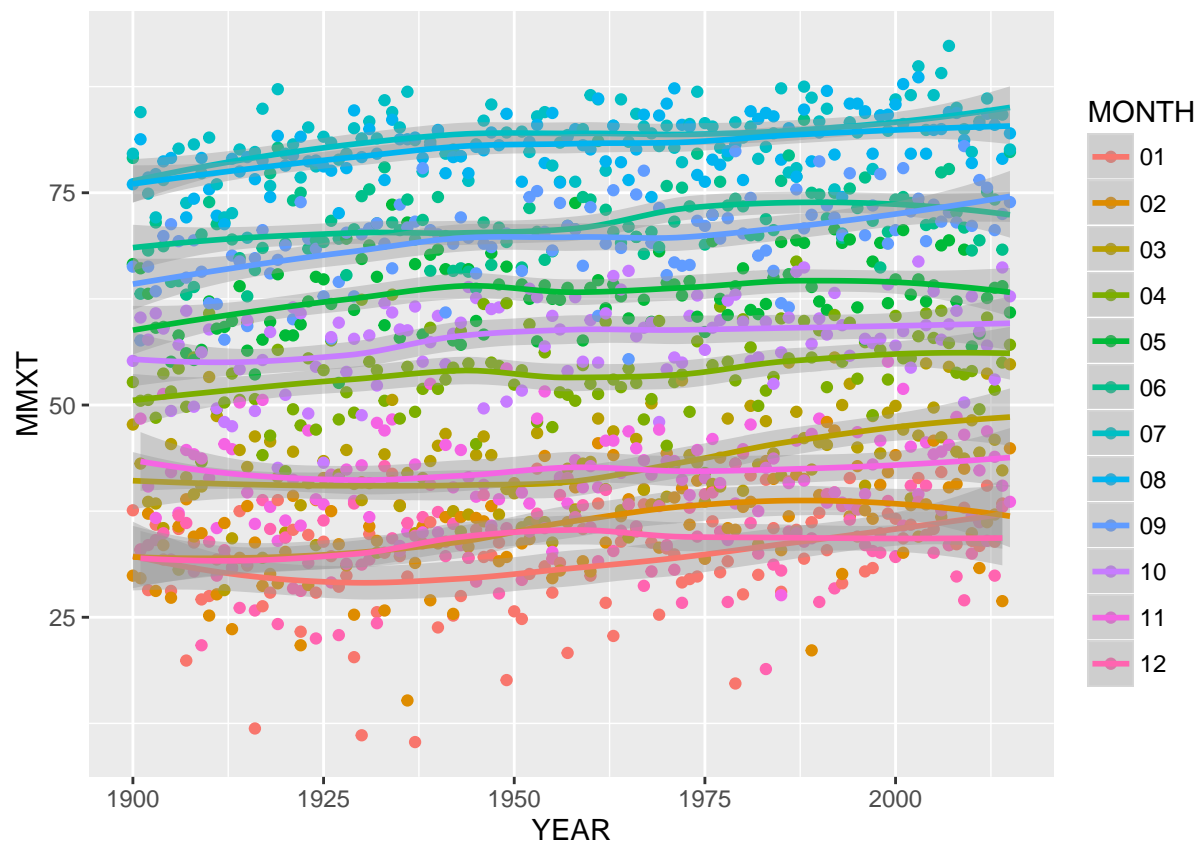
The model for January is as follows:

$$\widehat{temp}_i = -69.2902 + 0.0517 \text{ Year}_i$$

The model for July is as follows:

$$\widehat{temp}_i = -19.6994 + 0.0517 \text{ Year}_i$$

3.



It appears that December and November average temperatures have not changed much from 1900 to 2015, while January and March appear to have the most substantial increases over the 115 year period. It appears that average monthly temperature increased about 5 ° F over the 115 years, which is quite similar to the average rate of increase we discussed in the Oregon State temperature data in class.

4.

Below is the ANOVA table for testing if the the effect of time differs by month, using Type II sums of squares. We see in the table that there is strong evidence that the relationship between time and the mean temperature differs by month (F-stat = 2.1295 on an F(11, 1350) distribution, p-value = 0.016).

Table 1: Anova Table (Type II tests)

	Sum Sq	Df	F value	Pr(>F)
YEAR	4108	1	196.1	1.034e-41
MONTH	408393	11	1773	0
YEAR:MONTH	490.6	11	2.129	0.01603
Residuals	28276	1350	NA	NA

5.

```
01    02    03    04    05    06    07    08    09    10    11    12
"a"   "b"   "c"   "d"   "f"   "h"   "i"   "i"   "g"   "e"   "c"   "ab"
```

Simultaneous Confidence Intervals

Multiple Comparisons of Means: Tukey Contrasts

```
Fit: lm(formula = MMXT ~ YEAR + MONTH, data = rawd2)
```

Quantile = 3.2707

95% family-wise confidence level

Linear Hypotheses:

	Estimate	lwr	upr
02 - 01 == 0	3.70575	1.72701	5.68450
03 - 01 == 0	11.19799	9.21925	13.17674
04 - 01 == 0	21.99024	20.01149	23.96898
05 - 01 == 0	31.24123	29.25820	33.22425
06 - 01 == 0	39.72992	37.74690	41.71295
07 - 01 == 0	49.59080	47.59899	51.58261
08 - 01 == 0	48.49598	46.50858	50.48337
09 - 01 == 0	37.66381	35.67204	39.65559
10 - 01 == 0	25.86088	23.87352	27.84824
11 - 01 == 0	10.35817	8.37077	12.34557
12 - 01 == 0	1.78021	-0.21157	3.77199
03 - 02 == 0	7.49224	5.51779	9.46669
04 - 02 == 0	18.28448	16.31004	20.25893
05 - 02 == 0	27.53548	25.55674	29.51421
06 - 02 == 0	36.02417	34.04544	38.00291
07 - 02 == 0	45.88505	43.89753	47.87257
08 - 02 == 0	44.79023	42.80713	46.77332
09 - 02 == 0	33.95806	31.97055	35.94557
10 - 02 == 0	22.15513	20.17204	24.13822
11 - 02 == 0	6.65242	4.66932	8.63552
12 - 02 == 0	-1.92554	-3.91305	0.06197
04 - 03 == 0	10.79224	8.81779	12.76669
05 - 03 == 0	20.04323	18.06450	22.02197
06 - 03 == 0	28.53193	26.55319	30.51066
07 - 03 == 0	38.39281	36.40528	40.38033
08 - 03 == 0	37.29798	35.31489	39.28108
09 - 03 == 0	26.46582	24.47831	28.45333
10 - 03 == 0	14.66289	12.67980	16.64598
11 - 03 == 0	-0.83982	-2.82292	1.14328
12 - 03 == 0	-9.41778	-11.40529	-7.43027
05 - 04 == 0	9.25099	7.27226	11.22973
06 - 04 == 0	17.73969	15.76095	19.71842
07 - 04 == 0	27.60056	25.61304	29.58809
08 - 04 == 0	26.50574	24.52264	28.48884
09 - 04 == 0	15.67358	13.68607	17.66109

```

10 - 04 == 0   3.87065   1.88756   5.85374
11 - 04 == 0 -11.63206 -13.61516 -9.64896
12 - 04 == 0 -20.21002 -22.19753 -18.22251
06 - 05 == 0   8.48870   6.50568  10.47171
07 - 05 == 0  18.34957  16.35779  20.34135
08 - 05 == 0  17.25475  15.26739  19.24211
09 - 05 == 0   6.42259   4.43082   8.41436
10 - 05 == 0  -5.38035  -7.36771  -3.39299
11 - 05 == 0 -20.88306 -22.87042 -18.89569
12 - 05 == 0 -29.46101 -31.45278 -27.46925
07 - 06 == 0   9.86088   7.86910  11.85266
08 - 06 == 0   8.76605   6.77869  10.75342
09 - 06 == 0  -2.06611  -4.05788  -0.07434
10 - 06 == 0 -13.86904 -15.85640 -11.88168
11 - 06 == 0 -29.37175 -31.35912 -27.38439
12 - 06 == 0 -37.94971 -39.94148 -35.95794
08 - 07 == 0  -1.09482  -3.09092   0.90127
09 - 07 == 0 -11.92699 -13.92749  -9.92648
10 - 07 == 0 -23.72992 -25.72604 -21.73380
11 - 07 == 0 -39.23263 -41.22872 -37.23654
12 - 07 == 0 -47.81059 -49.81108 -45.81009
09 - 08 == 0 -10.83216 -12.82827  -8.83605
10 - 08 == 0 -22.63510 -24.62681 -20.64338
11 - 08 == 0 -38.13781 -40.12950 -36.14612
12 - 08 == 0 -46.71576 -48.71186 -44.71966
10 - 09 == 0 -11.80293 -13.79903  -9.80684
11 - 09 == 0 -27.30564 -29.30176 -25.30953
12 - 09 == 0 -35.88360 -37.88409 -33.88311
11 - 10 == 0 -15.50271 -17.49443 -13.51099
12 - 10 == 0 -24.08067 -26.07676 -22.08457
12 - 11 == 0  -8.57796 -10.57406  -6.58185

```

Using the above compact letter display, we see that the following months are not detectably different from each other, after accounting for the linear relationship between average temperatures and year.

- January and December
- February and December
- November and March

Overall, there is strong evidence that August and July were the warmest months on average and after accounting for yearly temperature changes. There was strong evidence that June was the next warmest, followed by September, then May, then October, then April, then March, and then November on average and after accounting for yearly temperature changes. There is strong evidence that December and February were the coolest months on average and after accounting for yearly temperature changes with no evidence of a difference between January and December under similar model conditions.

6.

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	-316	477	-0.663	0.507
MONTH02	3.71	0.605	6.13	1.18e-09

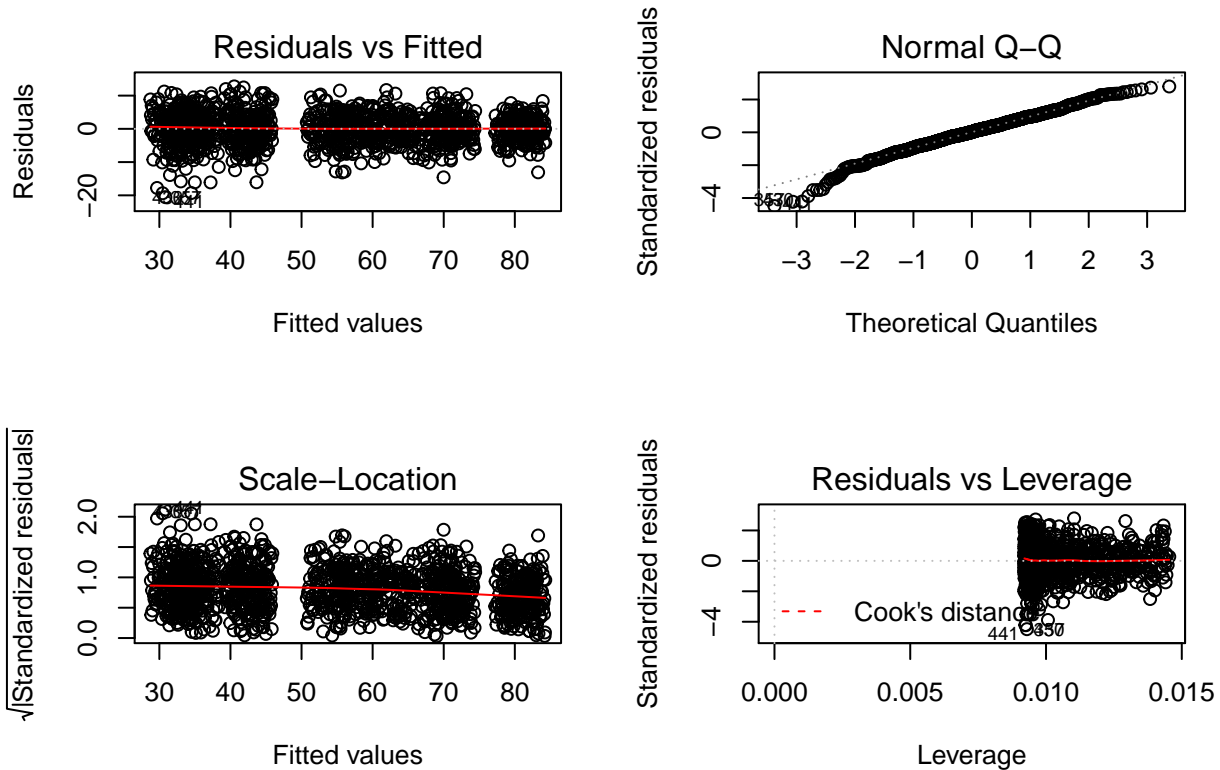
	Estimate	Std. Error	t value	Pr(> t)
MONTH03	11.2	0.605	18.5	2.24e-68
MONTH04	22	0.605	36.3	1.24e-202
MONTH05	31.2	0.606	51.5	6.32e-322
MONTH06	39.7	0.606	65.5	0
MONTH07	49.6	0.609	81.4	0
MONTH08	48.5	0.608	79.8	0
MONTH09	37.7	0.609	61.8	0
MONTH10	25.9	0.608	42.6	3.03e-252
MONTH11	10.4	0.608	17	3.5e-59
MONTH12	1.78	0.609	2.92	0.00354
YEAR	0.304	0.487	0.624	0.533
I(YEAR^2)	-6.45e-05	0.000125	-0.518	0.604

Testing for evidence of a quadratic relationship between average temperatures and year, after accounting for monthly variation and a linear year trend, we have the following hypothesis:

$$H_0 : \beta_{year^2} = 0 \quad H_A : \beta_{year^2} \neq 0$$

Using the above model output, there is no evidence of a quadratic relationship between average temperatures and year, after accounting for monthly variation and a linear year trend (t-stat = -0.518 \sim t_{1360} , p-value = 0.604).

7.



The monthly discreteness is apparent in the clumps in the residuals vs. fitted plot. It does appear that there is less spread in the larger fitted values than the smaller. Hence, the fitted values for the summer months show less variability than the fitted values for the cooler months. We also note the scale of the residuals, with residuals near -20 occurring in the cooler months. Observation 441, a January measurement in 1937 with a MMXT of 10.3, differs from all other January measurements by nearly 10 units.

8.

```
## Allison's R Version  
getRversion()
```

```
## [1] '3.3.1'
```