Question 5.1

#Import library

- > library(outliers)
- > library(ggplot2)

#Import data

- > data<- read.table("uscrime.txt",header=T)
- > crime<- data[,"Crime"]

#Check the data (In total, 47data points in one dataset)

> crime

[1] 791 1635 578 1969 1234 682 963 1555 856 705 1674 849 511 664 798 946 539 929 750 1225 742 439 1216 968 523 1993 342

[28] 1216 1043 696 373 754 1072 923 653 1272 831 566 826 1151 880 542 823 1030 455 508 849

For this experiment, it's important to set below hypothesis:

- 1. NULL hypothesis: The crime dataset is normally distributed.
- 2. Alternate hypothesis: The crime dataset is NOT normally distributed.

#Run Grubbs.Test on initial data.

#Test the right tail

> grubbs.test(crime,type=10)

Grubbs test for one outlier

data: crime

G = 2.81287, U = 0.82426, p-value = 0.07887

alternative hypothesis: highest value 1993 is an outlier

#Test the left tail
> grubbs.test(crime,type=10,opposite=TRUE)

Grubbs test for one outlier

data: crime

G = 1.45589, U = 0.95292, p-value = 1

alternative hypothesis: lowest value 342 is an outlier

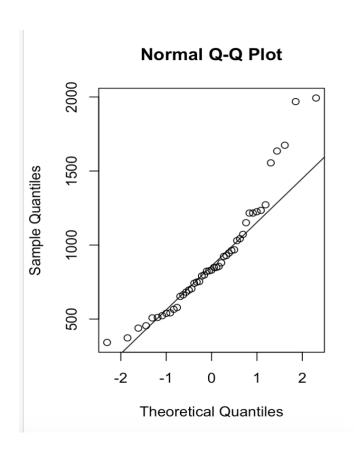
Result Analysis:

Since 0.07887 and 1, p-value for both tails respectively are greater than 0.05, it indicates that there is no outlier from this crime dataset, which means we don't reject Null hypothesis.

However, when using Grubbs. Test function, we assume the original data is normally distributed, which we haven't explore deeper on this assumption.

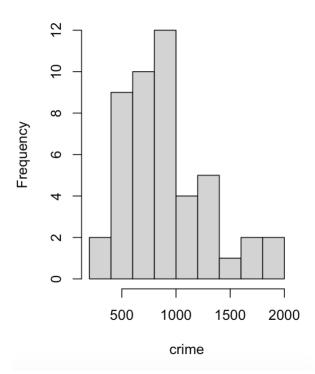
Firstly, we can take a look at below Normal QQ Plot.

- > qqnorm(crime)
- > qqline(crime)



#And histogram
>hist(crime)

Histogram of crime



From the QQ plot, it shows that most of the data points are falling along the QQ line (straight line) which infers they are normally distributed. And for histogram, it doesn't show a bell-shape which is an indicator for dataset not being normally distributed.

When diving deeper on this question, from statistical standpoint, we could utilize Shapiro-Wilk Test for Normality in R.

> shapiro.test(crime)

Shapiro-Wilk normality test

data: crime

W = 0.91273, p-value = 0.001882

As it shows that p-value is lower than 0.05, the data is not normal if the p-value is below 0.05. So we now know our variable is Not normally distributed.

Log transformation:

In order to ensure the assumption of Grubbs. Test is satisfied, we need to perform log transformation on our original dataset.

> log(crime)

[1] 6.673298 7.399398 6.359574 7.585281 7.118016 6.525030 6.870053 7.349231 6.752270 6.558198 7.422971 6.744059 6.236370 6.498282 6.682109

[16] 6.852243 6.289716 6.834109 6.620073 7.110696 6.609349 6.084499 7.103322 6.875232 6.259581 7.597396 5.834811 7.103322 6.949856 6.545350

[31] 5.921578 6.625392 6.977281 6.827629 6.481577 7.148346 6.722630 6.338594 6.716595 7.048386 6.779922 6.295266 6.712956 6.937314 6.120297

```
[46] 6.230481 6.744059 > crime_log<- log(crime) > shapiro.test(crime_log)
```

Shapiro-Wilk normality test

data: crime_log

W = 0.98709, p-value = 0.8778

Since p-value 0.8778 > 0.05, crime_log is normally distributed.

Finally, we re-test the crime_log with Grubbs.Test.

> grubbs.test(crime_log,type=10)

Grubbs test for one outlier

data: crime log

G = 2.16544, U = 0.89585, p-value = 0.6329

alternative hypothesis: lowest value 5.8348107370626 is an outlier

> grubbs.test(crime_log,type=10,opposite=TRUE)

Grubbs test for one outlier

data: crime_log

G = 2.12247, U = 0.89994, p-value = 0.712

alternative hypothesis: highest value 7.59739632021279 is an outlier

Conclusion: P-values for both tails are still greater than 0.05. Given that, we can conclude that there are no outliers in this dataset.

Question 6.1

Describe a situation or problem from your job, everyday life, current events, etc., for which a Change Detection model would be appropriate. Applying the CUSUM technique, how would you choose the critical value and the threshold?

CUSUM technique could be applied to detect change on my bedtime.

Since many people have suffered loss of sleep due to mounting pressure from their everyday life, a consistent amount of sleep can benefit our health and help us stay away from any potential chronical disease, such as hypertension or heart disease etc. Checking the daily bedtime hours and setting a change detection model to it could alert me from staying up late for a period time and get back on the right track.

According to CDC, the recommended amounts of sleep in every 24-hour period is 7 hours or more.

In order to choose the critical value(C in CUSUM) and threshold (T in CUSUM), we first need to have enough data points to analyze. The daily amount of sleep over the past 60 days (60 data points) would be a good starting point for exploring deeper.

Then, calculate the average amount the standard deviation(SD) of sleep over these 60 days. Use the recommended scheme to decide a starting point for C and T, which is C= SD/2 and T=SD*5. Visualize the daily amount via a line chart and an average line and check to see if the initial C and T give a sensible result and detect

the loss of sleep correctly. If not, adjusting the C and T value in the CUSUM formula until a more reasonable result surfaced. Then, the final C and T value could be used for future sleep deprivation detection.

Question 6.2.1

For the preparation of calculating CUSUM, we need to set the following parameters per year:

Mu = average temperature of July +August for each year, since In common sense, July and august are the most common month for summer. Given that, using average temperature for these 2 months as Mu will make my dataset more sensible to detect any changes between the break of summer and fall.

SD = standard deviation. $C_N = SD_N/2$

 $T = SD_N*5$

Then I calculate the CUSUM for each year from 1996 to 2015. See attached spreadsheet for detail. (I also uploaded the excel file in case you are interested in the formula:))

CUSUM = MAX $\{0, S_{t-1} + Mu - X_T - C\}$

5	98 0	86 O	1998 91 88 91	0 84 0.7673 0 82 3.5347	23607 9	9 0	84 O 87 O	90 0	73 9.71683108 81 11.4336622	82 1.16852978 81 3.33705955	91 0 89 0	93 0	95 0 85 1.69297806	85 O 87 O	95 0 90 0 89 0 91 0	87 0.58387317 84 4.16774633	92 0 94 0	105 0 92 0 99 0 98 0	82 O 85 O	90 0 93 0	
	97 0	93 0	91	0 87 1.302	0 9	a 0	87 0	87 0	87 7.15049324 86 3.86732431	86 0.50558933	86 O	93 0	82 6.38595612 86 7.07893418	91 0	89 0	84 4.16774633 83 8.7516195 85 11.3354927	95 0	99 0	76 4.9754386 77 8.95087721	87 0 84 0.13974593	
	89 0	84 0	91	0 90	0 9	6 0	86 0	93 0	80 6.58415539 84 5.30098647	90 0	89 0 82 1.11717305	90 0 81 4.07091557	88 5.77191224 87 5.4648903	88 0 82 1.34309143	80 2.606307	88 10.9193658 89 9.50323899	90 0	100 0 98 0	83 6.92631581 83 4.90175442	86 0	
- 5	93 0	75 6.8727464	93	0 91 0 82 2.7673		6 0	87 O	93 0	84 S.30098647 87 1.01781755	90 O	76 8.2343461	90 9 14193114		82 1.34309143 88 0	87 O	89 9.50323899 94 3.08711216	90 0	98 0	83 4.90175442 79 6.87719302	87 O	
- 5	91 0	87 1.74549281	95	0 86 1.5347	23607 9:	1 0	89 0	89 0	90 0	87 0	88 3.35151915	82 12.2127467 84 13.2836623	82 14.8508464 89 12.5438245	90 0	82 0.606307	97 0	94 0	95 0	88 0	90 0	
- 6	93 0	87 0	91	0 87	0 9	9 0	87 0	91 0	84 0	89 0	78 5.11717305	84 14.3545779		87 0	84 0	90 0	92 0	95 0	87 0	87 0	
- 5	0 0	84 0	91	0 82 2.7673 0 77 10.534	16803 9	6 0	90 0	84 0.49663012	84 0	90 0	83 5.2343461 86 2.35151915	90 9.42549343 91 3.496409	85 14.9297806 87 14.6227587	89 0	86 0	93 0	95 0	90 0 84 2.24478436	80 0.9754386	85 0	
- 6	93 0	86 0	88	0 73 22.302	1041 9:	1 0	86 0	77 7.99326023 82 10.4898904	87 0	91 0	84 1.4686922	91 0	86 15.3157367	85 0	84 0	91 0	97 0	90 0	78 2.9754386	89 0	
- 5	93 0 82 3.33873361	90 0	87	0 81 26.069	9402 9	3 0	82 0.62967709	88 6.98652047	84 0	91 0	87 O	91 0	84 18.0087148	88 0	89 0	91 0	90 7.74409995	90 0	85 O	90 0	
- 6	91 0	91 0	87	0 86 28.604 0 82 31.371	12082 9	a 0	84 0	91 0.48315059 93 0	88 0	84 0	85 0	91 0	86 24.3946709	89 0	90 0	89 0 87 0.58387317	85 10.4881977	92 0	87 0	83 1.13974593	
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- 5	96 0	89 0	95	0 88 25.906	3123 100	0 0	90 0	93 0	88 0	84 0	89 0	96 0	88 18.4736051	91 0	80 3.21261399	90 2.7516195 91 0 94 0	94 3.72049424	91 0	90 0	85 1.27949186 76 9.41922279	
- 5	91 0	89 0	91	0 90 20.672 0 90 15.441 0 91 9.2084	10484 9	3 0	84 0	95 0	89 0	89 0	90 0	93 0	86 19.8595612 79 27.5525393	95 0	86 0.42522799	94 0	92 0.46459309	90 0	87 0	82 11.5589837 83 12.6987296	
- 5	95 0	84 0	89	0 91 9.2084 0 93 0.9757	11642 9	6 0	87 0	91 0	86 0 81 1.71683108	89 0	91 0	91 0	79 27.5525393 82 32.2455173	92 0	84 0	95 0	94 0	95 0	85 0	83 12.6987296 88 8.83847558	
- 6	93 0	88 0	91	0 93	0 8	2 4.64387997	84 0	87 0	82 2.43366216 84 1.15049324	95 0	90 0	87 0	87 31.9384954 87 31.6314734	88 0	88 0	94 0	92 0	97 0	86 0	87 5.97822151	
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- 2	79 12.3549344	91 0	88 2.0745573	1 93	0 9:	1 15.2193999	84 0	91 0	89 0	89 0	90 0 83 0.11717305	96 0	89 25.7104076	93 0	89 0	90 0	90 0	97 0	86 0	90 0 82 2.13974593	
- 6	00 7.69366804 01 2.03240165	88 0 72 9.8727464	90	0 97	0 8	9 12.8632798 7 12.5071598	89 0	88 0	84 0	89 0	78 5.2343461 84 4.35151915	91 0	87 25.4033857 92 20.0963637	90 0	82 0.606307	95 0	96 0	96 0	90 0	84 2.27949186	
- 5	87 0.37113526 86 0	80 11.7454928	86	0 96	0 8	6 13.1510398 6 13.7949197	84 0	93 0	84 0	91 0	82 5.4686922	96 0	90 16.7893418 92 11.4823199	89 0	89 0	96 0	91 0	94 0	80 0.9754386 87 0	85 1.41923779 81 4.55898372	
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- 5	91 0	91 0 89 0	84 8.2236719 87 6.2609505	7 99	0 99	9 0	91 0	91 0	89 O	86 19.8538275 86 17.0223573	90 0	86 O	101 0 97 0	85 O	87 O	91 0	92 0	87 0 87 0	66 36.9263158 77 40.9017544	89 0	
- 6	0 0	89 0	90 1.2982292 79 7.3355078	2 98	0 10	1 0	87 0	91 0	90 0	89 11.1908871	89 0	88 0	95 0	90 0	90 0	92 0	96 0	84 2.24478436	82 39.877193 84 36.8526316	86 0	
- 3	80 0	82 0	84 8.3727865	3 91	0 8	7 0	88 0	93 0	88 0	88 6.35941686 82 7.52794663	94 0	91 0	99 0	85 0	88 0	93 0	94 0	84 4.48956872 88 2.73435307	84 33.8280702	92 0	
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	88 0 84 1.33873361 82 4.67746722	91 0	93	0 91 0.7673	0 81	8 0	81 1.62967709 82 2.25935419	78 11.9865205 77 19.4831506	88 0	88 0	85 0	88 0 80 5.07091557	89 O 86 O.69297806	89 2.0878229	79 7.81892099 79 11.425228	85 6.7516195 89 5.33549266	90 0	80 12.7343531 89 9.97913743	87 0	88 0	
- 8	30 10.0162008 73 22.3549344	88 0	87	0 99	0 2	9 7.64387997	80 4.88903128 75 12.5187084	84 19.9797807 84 20.4764108	88 0	82 1.16852978	85 0	85 5.14183114 86 4.21274672	84 3.38595612	81 2.34309143	79 11.425228 71 23.031535 78 27.637842	90 2.91936583	95 0	91 5.22392179	90 0	90 0	
- 3	73 22.3549344 37 20.693668	91 0	84 1.0372786 77 9.0745573	91 1 84 0.7673	0 8	1 13.2877599 2 17.9316399	75 12.5187084 73 22.1483855	84 20.4764108 89 15.9730409	86 0	80 4.33705955 81 6.50558933	88 0	86 4.21274672 85 4.28366229	84 3.38595612 83 7.07893418 88 5.77191224	85 0.68618287 83 1.0292743	78 27.637842 79 31.244149	91 0	96 0	91 5.22392179 89 2.46870615 85 3.7134905	84 0	90 0	
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- 5	27 20.3711353	81 1.74549281 82 1.61823921	91	0 96	0 8	1 23.2193999	90 16-4077397	93 0	84 0 73 9.71683108	84 6.84264888	81 2.11717305	83 3.42549343	89 0 85 1,69297806	88 0	83 30.456763	85 6.16774633	78 17.4881977	85 14.2030592	89 0	89 0	
- 6	39 13.0486025	86 0	90	0 91	0 6	6 64.5071598	88 11.0374168 87 6.66709385	88 0	75 17.4336622	81 9.01117865 86 6.17970843	81 4.2343461 83 4.35151915	85 3.496409 80 8.56732457	86 2.38595612	89 0	85 28.06207 84 26.669377	90 3.7516195 91 0.33549266	69 48.9763954	85 15.4478436 92 9.69262794	88 0	90 0	
- 5	89 9.38733608 91 3.72606969	88 0	89 6.0372786	0 91 5 77 7.7673	0 71	5 76.1510398 0 82.7949197	86 3.29677094 86 0	91 0	81 19.1504932 82 19.8673243	73 16.3482382 84 15.516768	85 2.4686922 86 0	83 10.6382401 83 12.7091557	88 1.07893418 89 0	90 0	87 22.275684 84 20.881991	92 0	73 63.7204942 81 70.4645931	88 7.93741229 83 11.1821967	91 0	84 0.13974593 84 0.27949186	
8	34 5.06480329	80 1.8727464	78 13.074557 81 17.11183	3 87 5.5347	73607 8	2 87.4387997	89 0	95 0	79 23.5841554	84 14.6852978	84 0	85 12.7800713	89 0	87 0	80 23.488298	94 0	84 74.2086919	84 13.426981	89 0	86 0	
- 5	86 4.4035369 88 1.74227051	82 1.74549281	81 17.11189 84 18.149114	6 87 3.302 6 87 1.0694	17214 9	4 90.0826797 6 90.7265596	87 0	95 0	80 26.3009865 81 28.0178175	84 13.8538275 81 16.0223573	84 O	84 13.8509869 82 16.9219024	89 0 86 0.69297806	83 0.34309143	75 31.094605 81 32.700912	96 0	96 75.9527908	83 16.6717654 81 21.9165497	89 0	90 0	
		87 0	99 14 196393	96	0 8	7 90.3704396 6 91.0143196	84 0	75 9.49663012	94 26 7246496	79 20 1909971	88 0	70 21 997919	95 2 39595612	86 0	90 35 3072199	86 1.58387317	89 75.4409885	91 27 1613341	87 0	86 0 78 6.13974593	
- 3	79 15.4197377 86 14.7584713	87 O	87 12.223671 87 10.260950		0 8	6 91.0143196 0 97.6581996	86 0 77 5.62967709	78 15.9932602 91 9.48989035	82 27.4514797 82 28.1683108	79 24.3594169 73 34.5279466	98 0 91 0	80 37.0637336 82 40.1346491	81 8.07893418 82 12.7719122	88 0 79 4.34309143	82 35.9135259 79 39.5198329	91 0	92 71.1850873 86 72.9291862	83 30.4061184 87 29.6509028	82 O	78 6.13974593 80 10.2794919	
	12 18.0972049 32 21.4359385	88 0	88 7.2982292 87 5.3355078	2 81 3.7673 8 81 7.5347	16803 7	109.30208 122.94596	77 11.2593542 81 12.8890313	88 5.98652047 86 4.48315059	81 29.8851419 81 31.6019729	75 42.6964764 80 45.8650062	88 0	83 42.2055647 85 42.2764803	76 23.4648903 78 32.1578684	80 7.68618287 69 22.0292743	82 40.1261399 73 49.7324469	89 0	72 88.673285 79 97.4173839	86 29.8956872 83 33.1404715	89 0 79 1.9754386	86 8.41923779 86 6.55898372	
- 3	78 28.7746722	88 0			21041 7	136 500030		81 7.9797807	81 33.318804	79 50.033536	88 0	95 42 2472959		92 23 3723667	80 52.3387539	93 0	77 108.161483	79 40 3953559	79 4 95097721	95 5 69977965	
- 3	78 28.7746722 79 25.1134058 79 41.4521394 78 48.790873	91 0	80 13.410065 82 16.447343 82 19.484622	2 79 16.069 8 68 32.836	14721 8	4 139.233719 7 138.877599	82 15.1483855 84 13.7780626 86 10.4077397	81 7.9797807 80 12.4764108 86 10.9730409	81 32.318804 84 32.0356351 87 27.7524662	78 55.2020657	90 0	79 48.4183114 73 60.489227	82 44.5438245 81 50.2368025 78 58.9297806	81 25.7154572 79 30.0585486	74 60.9450609 81 62.5513679	92 0	77 118.905582	81 45.6300402 79 52.8748246	84 1.92631581	84 5.83847558 83 6.97822151	
- 3	78 48.790873	89 0	82 19.484622	5 79 38.604	12082 7	7 148.521479	86 10.4077397			75 73.5391253	90 0	75 70.5601426	78 58.9297806	75 38.40164	79 66.1576749	95 0	86 126.393779		73 7.9754386		
8	81 53.1296066 84 54.4683402	70 11.8727464 80 13.7454928	88 16.521901 84 17.559179 81 21.596458	1 72 51.371	15762 7	1 167 909229	87 6.03741675 88 0.66709385 69 14.2967709	77 18.9663012 82 21.4629313 73 32.9595614	75 36.1861283	80 76.7076551	86 O	82 73.6310582 96 72 7019727	86 59.6227587 83 63.3157367	84 37.7447315 82 39.0878229	84 64.7639819	92 0	80 134.137878	87 53.3643933 81 58.6091777	82 6.95087721 82 5.92631581	82 6.25771337 77 13.3974593	
8	84 55.8070738	82 13.6182392	81 21.596458	4 78 67.906	3123 8	1 170.453119	69 14.2967709	73 32.9595614	80 40.619790G	82 77.0447146	88 0	84 73.7728893	89 61.0087148	78 44.4309143	85 61.9765959	88 0	82 144.626076	78 66.853962		78 19.5372052	
- 5	87 54.1458074 84 55.484541	70 41 363732	82 24.644747	1 81 71.678		2 175.096999	72 41 5561251	76 67 9629216	82 41.3366216 82 42.0534526	81 79.2132444 79 83.3817742	85 0 77 6.11717305	75 83.8438049 78 90.9147204	87 60.7016928 84 63.3946709	82 45.7740058 80 49.1170972	87 57.5829029 85 55.1892099	93 0 76 11.5838732	88 144.370175 86 146.114274	82 71.0987464 86 71.3435307	67 29.877193 78 32.8526316 79 34.8280702 77 38.8035088	77 26.6769512 74 36.8166971	
- 5	79 61.8232746 75 72.1620082	64 59.2364784 68 73.1092248	87 23.708294	4 78 81.208	24164 7	1 209.384759	75 49.1858022 78 53.8154793	75 67.4494518	82 42.7702837 73 52.4871148	72 94.5503039	86 3.2343461 85 1.35151915	79 96.985636	85 65.087649	77 55.4601886	80 57.7955169	81 18.1677463	84 149.858372 79 158.602471	88 69.5883151 86 69.8330994	79 34.8280702	78 42.956443 74 53.0961889	
- 3	22 85.5007418	77 77.9819712	87 23.708294 80 28.745573 75 38.782851	4 78 81.208 1 80 85.975 7 77 93.743	27844 71 21525 7	221.028639	71 65.4451564	79 72.9460819 73 84.442712	66 69.2039459	78 99.7188337 78 104.887363		81 101.056552 70 116.127467	85 65.087649 85 66.780627 81 72.4736051	86 52.8032801 86 50.1463715	83 57.4018239 72 68.0081309	81 18.1677463 76 29.7516195 79 38.3354927	84 162.34657	84 72.0778838		71 66.2359349	
- 6	4 106.839475 6 126.178209	86 73.8547176 75 80.727464	75 48.820130 86 47.85740			246.316399 7 255.960279	71 77.0748335 75 84.7045106		71 80.920777 72 91.637608	80 108.055893 82 109.224423	82 1.11717305 83 1.2343461	75 126.198383 83 128.269298	79 80.1665831 80 86.8595612	86 47.4894629 74 56.8325544	74 76.6144379 76 83.2207449	76 49.9193658 79 58.503239	78 172.090669 65 194.834768	72 86.3226682	77 47.754386 82 46.7298246	84 66.3756808 86 64.5154267	
_ 5	22 139.516943	73 89.6002104	78 54.894687	7 75 129.04	16267	9 263.604159	75 84.7045106 80 87.3341877	82 92.4359722 84 92.9326023 84 93.4292325	69 106 254429	82 110.392953	95 0	81 132,340214	92 94 5525393	74 56.8325544 74 66.1756458 80 69.5187372	75 90 9270519	79 58.503239 78 68.0871122	68 214.578867	75 97.5674525 72 111.812237	82 45.7052632	85 63.6551727	
8	24 140.855676 20 156.19441	75 96.4729568 78 100.345703	77 62.931966 82 65.96924	3 84 129.81 5 71 143.57	12625 8	2 268.248039	81 88.9638648 80 91.5935419	84 93.4292325 82 95.9258626	66 123.07127 77 128.788101	80 113.561483 81 115.730012	83 0.11717305	82 135.411129 84 136.482045	77 101.245517 80 107.938495		76 97.4333589 74 106.039666	68 87.6709853 67 108.254858	75 227.322965 80 235.067064	74 124.057021 82 128.301806	82 44.6807018 85 40.6561405	78 69.7949186 65 88.9346645	
- 2	70 156.19441 56 175.533143 54 196.871877	91 101 21945	82 65.96924 82 69.006523	5 71 143.57 6 73 155.34 3 71 169.11	7361 S	2 278.535799		82 95.9258626 87 93.4224927	79 122 504922	80 118.898542	85 0 81 2.11717305	84 136.482045 86 135.552961	80 107.938495 81 113.631473	83 70.2049201		70 125.838732	83 239.811163	92 122 54659		71 102.07441	
6	4 196.871877 0 222.210611	82 101.091196 82 100.963942	73 81.043802 82 84.081080	2 71 169.11 9 73 180.88	27097	2 292.179679 6 312.823559	70 107.852896 68 122.482573	86 91.9191228 80 96.4157529	75 141.221763 73 150.938595	75 127.067072	72 13.2343461 72 24.3515191	76 144.623876 72 157.694792	82 118 324451 83 122.01743	82 70.2049201 82 71.5480115 82 72.891103	71 138.25228 79 141.858587	70 125.838732 73 140.422605 81 147.006478	81 246.555262 79 255.299361	83 135.791374 68 154.036159	84 34.6070177 74 41.5824563	78 108.214156 82 110.353902	
3	28 229.549344	82 100.836689	69 100.1183	6 73 192.64	19465 51	344.467439		71 109.912383	73 160.655426	73 145-404131		72 170.765707					78 265,04346	63 177,280943		86 108.493648	
- 3	70 244.888078 72 258.226812	80 102.709435	72 113.15563 73 125.19291	8 72 205.41 7 72 218.18	16833 St	5 376.111319 1 398.755199	66 142.741927 73 152.371604	66 128.409013 70 142.905643	73 170.372257 73 180.089088	71 157.572661 71 169.741191	70 47.5858652 77 53.7030383	79 176.836623 80 181.907538	81 131.403386 81 137.096364 67 156.789342	75 92.5772858 77 98.9203773	85 142.071201 74 150.677508	85 155.174224 86 156.758097	72 280.787559 68 300.531657	70 193.525727 73 206.770512	26 55.5333335 80 56.5087721	86 106.633394 86 104.77314	
- 6	9 274.565545	82 102.454928	78 132.23019	7 72 218.18 6 73 229.95	1569 7	1 414.399079		78 149.402273	66 196.805919	77 175.909721	77 53.7030383 82 54.8202113	80 186.978454	67 156.789342	78 104.263469	77 156.283815	86 156.758097 86 158.341971	65 323.275756	75 218.015296	79 58.4842107	86 102.912886	
- 6	9 290.904279 73 303.243012	79 105.327674 80 107.200421	78 139.26747 78 146.30475	4 70 244.71 3 64 265.48	18937 7: 16305 7:	428.042959	78 164.630959 78 169.260636	84 149.898904 79 155.395534	78 201.52275 78 206.239581	73 186.078251 64 205.24678	74 63.9373844 77 70.0545574	71 201.04937 62 224.120285	72 171.48232 74 184.175298	77 110.60656 77 116.949652	66 172.890122 73 182.496429	80 165.925844	73 338.019855 74 351.763954	79 225.26008 75 236.504865	81 58.4596493 82 57.4350879	85 102.052632 85 101.192378	
3	79 309.581746	68 121.073167	75 156,34203	2 75 275.25	3673 7	451.330719	75 176 990212	68 171.892164	78 210.956412	63 225.41531	78 75.1717305	69 240.191201	79 192 969276	80 120.292743	66 199,102736	73 188.09359	77 362.508053	77 245.749649	77 61.4105265	75 110.332124	
5	31 313.92048 30 319.259213	63 139.945914 57 164.81866	79 162.3793 78 169.41658			7 460.974599 0 467.618479	75 184.51999 62 205.149667	57 199.388794 66 217.885424	69 224.673243 72 235.390074	62 246.58384 71 258.75237	79 79.2889035 76 86.4060766	70 255.262116 59 281.333032	78 201.561254 76 212.254232	81 122.635834 83 122.978926	61 220.709043 61 242.31535	78 197.677463 76 209.261336	80 370.252152 84 373.99625	77 254.994434 74 267.239218	68 74.3859651 74 81.3614037	69 125.47187 70 139.611616	
5	32 322.597947	66 180.691407	77 177.45386	7 80 299.55	5777 8	474.262359	60 227,779344	64 238,382054	68 250.106905	75 266.920899	75 94.5232496	71 295.403947	82 216.94721	69 137.322017	51 273,921657	80 216.84521	85 376.740349	75 278.484002	74 91.3614037 72 90.3368423 73 98.3122809	80 143.751362	
- 6	341.93668 3 364.275414	64 198.564153 69 211.436899	78 184.49114 82 187.52842	6 71 313.32 5 66 332.09	2314S 81 20513 2	0 480.906239 3 494.550119	64 246.409021 71 258.038698	68 254.878684 71 268.375314	70 262.823736 75 270.540567	73 277.089429 68 292.267669	81 96.6404227 83 96.7575957	77 303.474863 76 312.545770	77 226.640188 76 237.333166	67 153.665109 65 172.0082	SS 301.527964 61 323.134271	78 226.429083 82 232.012956	80 384.484448 67 405.229547	74 290.728787 73 303.973571	73 98.3122809 63 116.29773	76 151.891108 73 163.030853	
i	8 381.614148	70 223.309646	75 197.56570	8 60 356.85	7881 7	3 508.193999	75 265.668375	73 279.871944	78 275.257399	71 304.426489	83 96.8747688	69 328.616694	75 249.026144	66 189.351292	61 323.134271 68 337.740578	77 242.596829	59 433.972646	71 319.218355	70 127.263158	73 174.170599	
- 3	79 287.952881 R1 292.291615	70 235.182392 62 255.055139	73 209.60298 63 231.64026	1 72 200 20	22617 21	S 519.837879 9 527.481758	79 269.298052 80 271.92773	71 293.368575 64 313.865205	84 273.97423 78 278.691061	73 314.595019 73 324.763548	80 99.9919418 67 116.109115	69 344.68761 70 359.758525	78 257.719122 72 272.4121	72 200.694383 68 216.037474	71 349.346885 74 357.953192	80 250.180702 78 259.764575	63 458.716745 68 478.460844	76 329.46314 79 336.707924	72 136.238597 69 148.214035	77 181-310345 70 195-450091	
ě	9 408.630348	63 273.927885	62 253.67752 72 266.71481	9 57 417.15 8 59 442.92	1998S 7	539.125638	81 273.557407	59 339.361835	70 202 407002	70 337.932078	70 129.226288	53 391.829441	81 278.105079 59 305.798057	62 237.380566 54 266.723657	72 368.559499	76 271.348449	70 496.204942	78 344.952708	63 166.189474	72 207.589837	
- 3	73 420.969082	62 293.800631 75 300.673378	72 266.71481 75 276.75209	8 59 442.92 7 64 463.69	27353 71 24721 72	S 550.769518 8 559.413398	81 273.557407 79 277.187084 73 286.816761	68 355.858465 60 380.355095	73 293.124723 73 302.841554	73 348.100608 78 353.269138	SG 156.343461 S4 185.460634	SG 420.900356 SS 450.971272	59 305.798057 61 331.491035	54 266.723657 67 283.066749	69 382.165806 65 399.772113	76 271.348449 81 277.932322 76 289.516195	73 510.949041 76 522.69314	79 352.197493 80 358.442277	66 181.164913 56 206.140351	74 217.729583	
- 3	5 443.646549	71 311.546124	79 282.78937	5 69 479.46	2089 71	571.057278		68 396.851725	68 317.558385	79 357.437667	61 207.577807	62 474.042188		70 296,40984	69 417.37842		77 533.437239	80 364.687061	61 226.11579	84 225.009075	
- 2	75 453.985283 R1 458.324016	57 336.418871 55 363.291647	79 288.82665 79 294.86393	4 75 489.22 3 73 500.99	19457 71 16825 94	8 579.701158 0 586.345038	S1 337.076115 SS 364.705792	69 412.348355 75 421.844985	64 336.275216 57 361.992047	81 359.606197 78 364.774737	62 248.812153	66 493.113103 63 515.194010	67 369.876991 70 386.569969	59 320.752932 50 354.096023	60 439.984727 71 451.591034	76 203.683941 74 217.267814	79 542.181338 74 555.925437	70 380.931846 56 411.17663	69 238.091228 64 255.066667	84 225.148821 77 232.289567	
8	12 461.66275	64 381.164363	78 301.90121 92 304.9294	1 72 513.76	64194 7	5 597.988918 7 607.632799	63 384.335469	75 431.341615	57 361.992047 70 374.708878 27 390.425709	75 372.943257	64 267.929326	72 528.254934	62 411.262947	59 378.439115	75 459.197341		59 584.669536		75 261.042106 29 264.017544	73 243.428313	
- 5	82 465.001484 81 469.340217	60 418.909856	82 304.9384 79 310.97576	9 75 523.53 9 75 533.2	19893 71	616.276678	72 394.965146 71 406.594823	68 447.838246 60 472.334876	77 380.425709 75 388.14254	78 378.111787 82 379.280316	69 282.046499 70 295.163672	73 540.32585 68 557.396765	67 430.955925 71 446.648903	65 396.782206 67 413.125297	66 475.803648 69 489.409955	71 353.435561 75 366.019434	61 611.413634 65 634.152733	SG 471.666199 GS 492.910983	78 264.017544 74 270.992983	68 259.568059 63 280.707805	
96	59 40.00	951166 3	2.0465683	48.6166422	47.593458	4 44.	1225839	17.130473	15.0897537	13.3147022	38.6669792	48.9682636	45.1669936 4	1.6658599 4	5.0659623 3	7.2257845 46	.6557857	46.2618338	38.6327107	32.9573794	43.546
ě			20465683 8.2419355	4.86166422 89.6290323	4.7593458 91.403225				8.50897537 86.2258065	8.33147022 86.5	3.86669792 86.983871	4.89682636 89.9677419					96557857 1.7096774	4.62618338		3.29573794	4.3546
O.																					

The cut off line for each year varies (SD_n*5). So below is the summary of unofficial summer happens in each year. In summary, I calculate the average of this 20 dates and come up with the final unofficial summer date is Sep 22.

	Cut off
Year	date
1996	21-Sep
1997	27-Sep
1998	29-Sep
1999	22-Sep
2000	07-Sep
2001	26-Sep
2002	25-Sep
2003	22-Sep
2004	15-Sep
2005	09-Oct
2006	20-Sep
2007	20-Sep
2008	24-Sep
2009	17-Sep
2010	29-Sep
2011	08-Sep
2012	20-Sep
2013	28-Sep
2014	26-Sep
2015	22-Sep
Average	22-Sep

Question 6.2.2

Use a CUSUM approach to make a judgment of whether Atlanta's summer climate has gotten warmer in that time (and if so, when).

In 6.2.1, we conclude that unofficial summer end on Sep 20ish. In this question, since it asks the Atlanta's summer climate, so we place our focus solely on the average temperature in a series of time between July1- Sep 20ish. (before unofficial summer end)

Setting parameters:

Mu = average summer season (July1- Sep 20ish.) temperate for 20 years

SD = Standard deviation

C = SD/2

T= C*5

Mu	87.61862401
SD	2.05038968
С	1.02519484
Т	10.2519484

we could see below table, as we run CUSUM on these 20 data points. The highest amount is 6.05 which happens in 2011. This amount is still less than our set T(10). So we need to tweak the parameter T to fit these data. We changed the T = SD*2 = 4.1

Below is the result showing that summer climate is truly gotten warmer since 2011, as the data onward from 2011 hit our threshold

T = SD*2 = 4.1.

Year	Cut off date	Average Summer climate	CUSUM-Detect an increase
1996	21-Sep	88.12195122	0
1997	27-Sep	85.88636364	0
1998	29-Sep	87.11111111	0
1999	22-Sep	88.63855422	0
2000	07-Sep	90.33823529	1.694416445
2001	26-Sep	85.42528736	0
2002	25-Sep	88.30232558	0
2003	22-Sep	85.21686747	0
2004	15-Sep	85.56578947	0
2005	09-Oct	86.02	0
2006	20-Sep	88.28395062	0
2007	20-Sep	89.69135802	1.047539175
2008	24-Sep	86.54117647	0
2009	17-Sep	85.82051282	0
2010	29-Sep	90.81111111	2.167292262
2011	08-Sep	91.82608696	5.349560368
2012	20-Sep	89.34567901	6.051420531
2013	28-Sep	84.58426966	1.991871345
2014	26-Sep	86.7816092	0.12966169
2015	22-Sep	88.06024096	0
Average	22-Sep		
	Mu	87.61862401	
	SD	2.05038968	
	С	1.02519484	
	T	4.100779359	