Cloud Computing Big Data Analysis Project

Submitted by Sai Sahaja Madhyahnapu (M12467281) The project will perform Data analysis and processing using Map reduce processing in python. It will use the data from GHNC Daily: ftp://ftp.ncdc.noaa.gov/pub/data/ghcn/daily/readme.txt. It has records of data from 2000 to 2018 which contains maximum and minimum temperatures recorded with station ID's.

In particular, the processing obtains the following results:

- Average TMIN, TMAX for each year excluding abnormalities or missing data
- Maximum TMAX, Minimum TMIN for each year excluding abnormalities or missing data
- 5 hottest, 5 coldest weather stations for each year excluding abnormalities or missing data
- Hottest and coldest day and corresponding weather stations in the entire dataset

I chose MapReduce because it is scalable, flexible, fast and have parallel processing. And also, it is easy to exclude abnormalities in MapReduce. I run the mapper and reducer files in Hadoop cluster. The obtained output is saved in a csv file and exported it to Excel and have done the analysis.

Results:

Average TMAX and TMIN:

V	A T. 4AV	A Th 4101
Year	Average TMAX	Average TMIN
2000	175.588292	44.30704639
2001	178.7506964	47.92369897
2002	177.2364563	46.55436225
2003	177.0952437	48.62549307
2004	174.9770195	49.55504364
2005	177.9061243	49.9807912
2006	181.089305	51.120869
2007	178.4365732	49.22216519
2008	170.3911742	40.93179589
2009	169.1661447	43.70164404
2010	171.781345	47.47453654
2011	172.7793752	46.29123543
2012	184.4661432	53.87463503
2013	168.028435	43.53508188
2014	169.2431074	44.31857444
2015	178.0581972	54.04334792
2016	179.8717209	55.58451407
2017	176.5666926	52.69286723
2018	78.86609582	-37.35880684

Maximum TMAX and Minimum TMIN:

Year	Max TMAX	Min TMIN
2000	522	-578
2001	528	-528
2002	533	-472
2003	533	-500
2004	517	-533
2005	539	-550
2006	528	-528
2007	556	-539
2008	528	-578
2009	533	-556
2010	517	-533
2011	511	-517
2012	537	-544
2013	539	-528
2014	522	-500
2015	556	-528
2016	539	-469
2017	528	-520
2018	400	-528

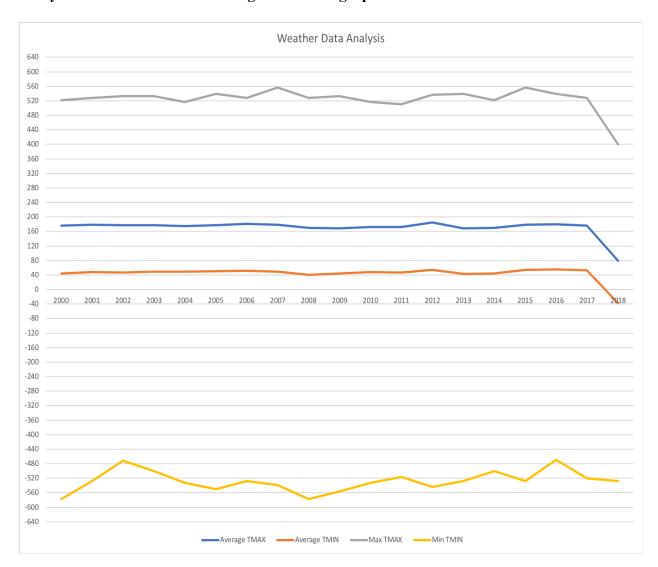
5 Hottest and 5 Coldest stations:

Year	Hottest Weather Stations	Coldest weather stations
2000	['USC00042319', 'USW00003104', 'USR0000AHAV', 'USC00021050', 'USC00024761']	['USC00508140', 'USW00026440', 'USC00502350', 'USC00505644', 'USC00501684']
2001	['USC00042319', 'USR0000AHAV', 'USC00024829', 'USC00021050', 'USR0000CMOJ']	['USR0000ABCA', 'USC00508470', 'USS0051R01S', 'USW00026508', 'USC00504567']
2002	['USR0000CMOJ', 'USC00042319', 'USC00265846', 'USC00044297', 'USR0000CCOR']	['USR0000CMOJ', 'USC00042319', 'USC00265846', 'USC00044297', 'USR0000CCOR']
2003	['USC00021050', 'USR0000CMEA', 'USR0000AHAV', 'USC00029376', 'USC00042319']	['USS0050S01S', 'USC00501492', 'USC00509869', 'USS0051R01S', 'USW00026533']
2004	['USC00042319', 'USW00053139', 'USC00261371', 'USC00021050', 'USC00024761'	['USC00501684', 'USC00502568', 'USS0045010S', 'USW00026412', 'USC00503009']
2005	['USW00023179', 'USC00042319', 'USR0000CMOJ', 'USW00053139', 'USC00029376']	['USW00026412', 'USC00509869', 'USC00509313', 'USC00502568', 'USC00501684']
2006	['USR0000CMOJ', 'USC00044259', 'USW00053139', 'USC00042319', 'USC00029376']	['USS0051R01S', 'USC00501492', 'USR0000ACHL', 'USR0000ABEV', 'USR0000ASEL']
2007	['USW00053139', 'USR0000AHAV', 'USR0000CSAW', 'USC00021050', 'USC00042319']	['USR0000ACHL', 'USC00502607', 'USW00026422', 'USC00501684', 'USS0045R01S']
2008	['USC00261371', 'USC00042319', 'USC00024761', 'USC00044297', 'USW00053139']	['USS0045R01S', 'USR0000ACHL', 'USR0000ABEV', 'USC00501684', 'USC00501492']
2009	['USW00053139', 'USR0000CSQU', 'USR0000CBUU', 'USC00042319', 'USR0000CMOJ']	['USC00502101', 'USC00501684', 'USC00509313', 'USR0000AEAG', 'USW00026412']
2010	['USC00021050', 'USR0000AHAV', 'USR0000CBUU', 'USC00042319', 'USR0000CMOJ']	['USC00501684', 'USR0000ACHL', 'USS0045R01S', 'USS0051R01S', 'USC00502101']
2011	['USC00042319', 'USR0000CCAA', 'USW00053139', 'USR0000CBUU', 'USC00022782']	['USC00509869', 'USC00501492', 'USS0051R01S', 'USC00501684', 'USR0000ANOR']
2012	['USW00053139', 'USR0000AHAV', 'USC00021050', 'USS0005N23S', 'USC00042319']	['USC00504210', 'USC00503165', 'USS0051R01S', 'USS0045R01S', 'USC00503212']
2013	['USW00053139', 'USW00004134', 'USR0000AHAV', 'USC00044297', 'USC00042319']	['USS0051R01S', 'USS0045004S', 'USS0045R01S', 'USC00502339', 'USC00501684']
2014	['USW00053139', 'USC00042319', 'USC00028396', 'USW00003125', 'USS0009S04S']	['USC00501684', 'USR0000ABCK', 'USS0048V01S', 'USS0051R01S', 'USS0045R01S']
2015	['USW00053139', 'USR0000CBUU', 'USW00003104', 'USC00045502', 'USC00042319']	['USS0041P07S', 'USC00509314', 'USW00026533', 'USC00501684', 'USS0045R01S']
2016	['USC00042319', 'USW00023179', 'USC00040924', 'USW00053139', 'USR0000CBEV']	['USR0000ALOS', 'USC00501684', 'USR0000ACHL', 'USS0045R015', 'USS0041P07S']
2017	['USW00053139', 'USC00021050', 'USW00023179', 'USC00046386', 'USC00042319']	['USR0000ASLC', 'USS0051R01S', 'USS0045004S', 'USW00026529', 'USR0000ALIV']
2018	['USC00417624', 'USC00411524', 'USR0000CCAA', 'USW00012959', 'USR0000TFAL']	['USW00096406', 'USR0000AKAV', 'USR0000ANOR', 'USW00026529', 'USC00502339']

Hottest Day and Coldest Day:

Day	Date	Station ID
Hottest Day	20071013	USR0000CSAW
Coldest day	20000101	USC00501684

Analysis of obtained results from given data in graph format:



Link to Github:

https://github.uc.edu/madhyasa/Cloud-Project-2

https://github.uc.edu/madhyasa/Cloud-Project-2/blob/master/README.md

Appendix:

Mapper.py

```
#!/usr/bin/env python
import sys
import csv
file = csv.reader(sys.stdin)
for line in file:
  if line[5] == "" and line[4] != "P" and line[6] != "" and (line[2] == 'TMAX') or line[2] == ""
'TMIN') and line[3] != -9999:
    print '%s\t%s\t%s\t%s\t%s' % (line[1], line[0], line[2], line[3])
Reducer.py
#!/usr/bin/env python
from operator import itemgetter
import sys
tmax = 0
tmin = 0
maxtmx = 0
mintmn = 999999
tmaxct = 0
tminct = 0
currentyear = None
year = None
element = None
value = 0
date = None
stationid = None
hottestweatherstationsids = []
coldestweatherstationsids = []
hottestweatherstationsvalues = []
coldestweatherstationsvalues = []
hottestvalue = 0
coldestvalue = 999999
hottestday = None
coldestday = None
hottestdaystationid = None
coldestdaystationid = None
```

```
for line in sys.stdin:
  line = line.strip()
  date, stationid, element, value = line.split('\t', 3)
  year = str(date)[:4]
  try:
     value = int(value)
  except ValueError:
     continue
  if currentyear is None:
     currentyear = year
  if year == currentyear:
     if element == "TMAX":
       tmax += value
       if value > maxtmx:
          maxtmx = value
       tmaxct += 1
     elif element == "TMIN":
     tmin += value
       if value < mintmn:
          mintmn = value
       tminct += 1
     if value > hottestvalue:
       hottestvalue = value
       hottestdaystationid = stationid
       hottestday = date
     if value < coldestvalue:
       coldestvalue = value
       coldestdaystationid = stationid
       coldestday = date
     if len(hottestweatherstationsids) < 5:
       hottestweatherstationsids.append(stationid)
       hottestweatherstationsvalues.append(value)
     else:
       minhottestvalue = min(hottestweatherstationsvalues)
       if minhottestvalue < value and stationid not in hottestweatherstationsids:
```

```
for idx, i in enumerate(hottestweatherstationsvalues):
           if i == minhottestvalue:
              hottestweatherstationsvalues[idx] = value
              hottestweatherstationsids[idx] = stationid
              break
    if len(coldestweatherstationsids) < 5:
      coldestweatherstationsids.append(stationid)
      coldestweatherstationsvalues.append(value)
      maxcoldestvalue = max(coldestweatherstationsvalues)
      if maxcoldestvalue > value and stationid not in coldestweatherstationsids:
         for idx, i in enumerate(coldestweatherstationsvalues):
           if i == maxcoldestvalue:
              coldestweatherstationsvalues[idx] = value
              coldestweatherstationsids[idx] = stationid
              break
else:
    print '%s' % currentyear
    print 'Average TMAX\t%s\t' % (tmax * 1.0 / tmaxct)
    print 'Average TMIN\t%s\t' % (tmin * 1.0 / tminct)
    print 'Max TMAX\t%s\t' % maxtmx
    print 'Min TMIN\t%s\t' % mintmn
    print 'Hottest Weather Stations\t%s' % hottestweatherstationsids
    print 'Coldest Weather Stations\t%s' % coldestweatherstationsids
    currentyear = year
    tmax = 0
    tmin = 0
    maxtmx = 0
    mintmn = 999999
    tmaxct = 0
    tminct = 0
    hottestweatherstationsids = []
    hottestweatherstationsvalues = []
    coldestweatherstationsids = []
    coldestweatherstationsvalues = []
    if element == "TMAX":
      tmax = value
      maxtmx = value
      tmaxct = 1
    elif element == "TMIN":
      tmin = value
      mintmn = value
      tminct = 1
```

```
if value < coldestvalue:
       coldestvalue = value
       coldestdaystationid = stationid
       coldestday = date
     if value > hottestvalue:
       hottestvalue = value
       hottestdaystationid = stationid
       hottestday = date
if year == currentyear:
  print '%s' % currentyear
  print '%s\tAverage TMAX\t%s\t' % (currentyear, (tmax * 1.0 / tmaxct))
  print '%s\tAverage TMIN\t%s\t' % (currentyear, (tmin * 1.0 / tminct))
  print '%s\tMax TMAX\t%s\t' % (currentyear, maxtmx)
  print '%s\tMin TMIN\t%s\t' % (currentyear, mintmn)
  print '%s\tHottest Weather Stations\t%s' % (currentyear, hottestweatherstationsids)
  print '%s\tColdest Weather Stations\t%s' % (currentyear, coldestweatherstationsids)
  print '\n'
  print 'Hottest Day\t%s\t - StationID\t%s' % (hottestday, hottestdaystationid)
  print 'Coldest Day\t%s\t - StationID\t%s' % (coldestday, coldestdaystationid)
```

Logfile:

madhyasa@hadoop-gate-0:~/CloudPratice\$ hadoop jar /usr/hdp/2.6.3.0-235/hadoop-mapreduce/hadoop-streaming-2.7.3.2.6.3.0-235.jar -file map.py -mapper map.py -file red.py -reducer red.py -input /user/tatavag/PIIweather -output result4.csv

18/04/24 21:42:39 WARN streaming.StreamJob: -file option is deprecated, please use generic option -files instead.

packageJobJar: [map.py, red.py] [/usr/hdp/2.6.3.0-235/hadoop-mapreduce/hadoop-streaming-2.7.3.2.6.3.0-235.jar] /tmp/streamjob4163282495771342433.jar tmpDir=null

18/04/24 21:42:40 INFO client.RMProxy: Connecting to ResourceManager at hadoop2-0-0.cscloud.ceas.uc.edu/192.168.2.20:8050

18/04/24 21:42:40 INFO client.AHSProxy: Connecting to Application History server at hadoop2-0-0.cscloud.ceas.uc.edu/192.168.2.20:10200

18/04/24 21:42:40 INFO client.RMProxy: Connecting to ResourceManager at hadoop2-0-0.cscloud.ceas.uc.edu/192.168.2.20:8050

18/04/24 21:42:40 INFO client.AHSProxy: Connecting to Application History server at hadoop2-0-0.cscloud.ceas.uc.edu/192.168.2.20:10200

18/04/24 21:42:41 INFO mapred. FileInputFormat: Total input paths to process: 19

18/04/24 21:42:41 INFO mapreduce.JobSubmitter: number of splits:37

```
18/04/24
                     INFO
                              mapreduce.JobSubmitter:
                                                        Submitting
                                                                                   job:
           21:42:41
                                                                     tokens
                                                                              for
job 1524342268806 0173
18/04/24
             21:42:42
                          INFO
                                     impl. YarnClientImpl:
                                                              Submitted
                                                                             application
application 1524342268806 0173
18/04/24 21:42:42 INFO mapreduce.Job: The url to track the job: http://hadoop2-0-
0.cscloud.ceas.uc.edu:8088/proxy/application 1524342268806 0173/
18/04/24 21:42:42 INFO mapreduce. Job: Running job: job 1524342268806 0173
18/04/24 21:42:49 INFO mapreduce. Job: Job job 1524342268806 0173 running in uber mode:
false
18/04/24 21:42:49 INFO mapreduce. Job: map 0% reduce 0%
18/04/24 21:43:00 INFO mapreduce. Job: map 1% reduce 0%
18/04/24 21:43:01 INFO mapreduce. Job: map 4% reduce 0%
18/04/24 21:43:02 INFO mapreduce. Job: map 6% reduce 0%
18/04/24 21:43:03 INFO mapreduce. Job: map 7% reduce 0%
18/04/24 21:43:04 INFO mapreduce. Job: map 12% reduce 0%
18/04/24 21:43:05 INFO mapreduce. Job: map 17% reduce 0%
18/04/24 21:43:06 INFO mapreduce. Job: map 20% reduce 0%
18/04/24 21:43:07 INFO mapreduce.Job: map 28% reduce 0%
18/04/24 21:43:08 INFO mapreduce.Job: map 31% reduce 0%
18/04/24 21:43:09 INFO mapreduce.Job: map 36% reduce 0%
18/04/24 21:43:10 INFO mapreduce. Job: map 44% reduce 0%
18/04/24 21:43:11 INFO mapreduce. Job: map 46% reduce 0%
18/04/24 21:43:12 INFO mapreduce.Job: map 52% reduce 0%
18/04/24 21:43:13 INFO mapreduce.Job: map 55% reduce 0%
18/04/24 21:43:14 INFO mapreduce.Job: map 56% reduce 0%
18/04/24 21:43:15 INFO mapreduce. Job: map 58% reduce 0%
18/04/24 21:43:16 INFO mapreduce. Job: map 61% reduce 0%
18/04/24 21:43:17 INFO mapreduce. Job: map 63% reduce 0%
18/04/24 21:43:18 INFO mapreduce. Job: map 65% reduce 0%
18/04/24 21:43:19 INFO mapreduce. Job: map 67% reduce 0%
18/04/24 21:43:20 INFO mapreduce. Job: map 70% reduce 0%
18/04/24 21:43:21 INFO mapreduce. Job: map 74% reduce 0%
18/04/24 21:43:22 INFO mapreduce. Job: map 74% reduce 11%
18/04/24 21:43:23 INFO mapreduce. Job: map 77% reduce 11%
18/04/24 21:43:24 INFO mapreduce. Job: map 79% reduce 11%
18/04/24 21:43:25 INFO mapreduce. Job: map 80% reduce 14%
18/04/24 21:43:26 INFO mapreduce. Job: map 81% reduce 14%
18/04/24 21:43:27 INFO mapreduce. Job: map 85% reduce 14%
18/04/24 21:43:28 INFO mapreduce. Job: map 85% reduce 15%
18/04/24 21:43:29 INFO mapreduce. Job: map 87% reduce 15%
18/04/24 21:43:37 INFO mapreduce. Job: map 87% reduce 18%
18/04/24 21:43:40 INFO mapreduce. Job: map 87% reduce 23%
18/04/24 21:43:45 INFO mapreduce. Job: map 88% reduce 23%
18/04/24 21:43:51 INFO mapreduce. Job: map 90% reduce 23%
18/04/24 21:43:53 INFO mapreduce. Job: map 90% reduce 25%
18/04/24 21:43:54 INFO mapreduce. Job: map 91% reduce 25%
```

```
18/04/24 21:43:56 INFO mapreduce. Job: map 91% reduce 29%
18/04/24 21:44:02 INFO mapreduce.Job: map 92% reduce 29%
18/04/24 21:44:03 INFO mapreduce. Job: map 93% reduce 29%
18/04/24 21:44:05 INFO mapreduce. Job: map 94% reduce 29%
18/04/24 21:44:08 INFO mapreduce. Job: map 95% reduce 29%
18/04/24 21:44:27 INFO mapreduce.Job: map 97% reduce 29%
18/04/24 21:44:28 INFO mapreduce. Job: map 99% reduce 29%
18/04/24 21:44:48 INFO mapreduce. Job: map 100% reduce 29%
18/04/24 21:44:51 INFO mapreduce. Job: map 100% reduce 30%
18/04/24 21:44:57 INFO mapreduce. Job: map 100% reduce 31%
18/04/24 21:45:15 INFO mapreduce. Job: map 100% reduce 32%
18/04/24 21:45:24 INFO mapreduce. Job: map 100% reduce 33%
18/04/24 21:45:33 INFO mapreduce.Job: map 100% reduce 44%
18/04/24 21:45:36 INFO mapreduce. Job: map 100% reduce 67%
18/04/24 21:45:51 INFO mapreduce. Job: map 100% reduce 68%
18/04/24 21:46:10 INFO mapreduce. Job: map 100% reduce 69%
18/04/24 21:46:29 INFO mapreduce. Job: map 100% reduce 70%
18/04/24 21:46:47 INFO mapreduce. Job: map 100% reduce 71%
18/04/24 21:47:05 INFO mapreduce. Job: map 100% reduce 72%
18/04/24 21:47:23 INFO mapreduce. Job: map 100% reduce 73%
18/04/24 21:47:41 INFO mapreduce. Job: map 100% reduce 74%
18/04/24 21:47:56 INFO mapreduce. Job: map 100% reduce 75%
18/04/24 21:48:14 INFO mapreduce. Job: map 100% reduce 76%
18/04/24 21:48:32 INFO mapreduce. Job: map 100% reduce 77%
18/04/24 21:48:51 INFO mapreduce.Job: map 100% reduce 78%
18/04/24 21:49:09 INFO mapreduce. Job: map 100% reduce 79%
18/04/24 21:49:27 INFO mapreduce. Job: map 100% reduce 80%
18/04/24 21:49:45 INFO mapreduce. Job: map 100% reduce 81%
18/04/24 21:50:03 INFO mapreduce. Job: map 100% reduce 82%
18/04/24 21:50:21 INFO mapreduce. Job: map 100% reduce 83%
18/04/24 21:50:39 INFO mapreduce. Job: map 100% reduce 84%
18/04/24 21:50:57 INFO mapreduce. Job: map 100% reduce 85%
18/04/24 21:51:15 INFO mapreduce. Job: map 100% reduce 86%
18/04/24 21:51:35 INFO mapreduce. Job: map 100% reduce 87%
18/04/24 21:51:50 INFO mapreduce.Job: map 100% reduce 88%
18/04/24 21:52:08 INFO mapreduce. Job: map 100% reduce 89%
18/04/24 21:52:26 INFO mapreduce. Job: map 100% reduce 90%
18/04/24 21:52:44 INFO mapreduce. Job: map 100% reduce 91%
18/04/24 21:53:02 INFO mapreduce. Job: map 100% reduce 92%
18/04/24 21:53:20 INFO mapreduce. Job: map 100% reduce 93%
18/04/24 21:53:38 INFO mapreduce. Job: map 100% reduce 94%
18/04/24 21:53:57 INFO mapreduce. Job: map 100% reduce 95%
18/04/24 21:54:15 INFO mapreduce. Job: map 100% reduce 96%
18/04/24 21:54:33 INFO mapreduce. Job: map 100% reduce 97%
18/04/24 21:54:51 INFO mapreduce. Job: map 100% reduce 98%
18/04/24 21:55:09 INFO mapreduce. Job: map 100% reduce 99%
```

```
18/04/24 21:55:27 INFO mapreduce.Job: map 100% reduce 100%
```

18/04/24 21:55:34 INFO mapreduce.Job: Job job 1524342268806 0173 completed successfully

18/04/24 21:55:34 INFO mapreduce.Job: Counters: 51

File System Counters

FILE: Number of bytes read=3389252780

FILE: Number of bytes written=6784331842

FILE: Number of read operations=0

FILE: Number of large read operations=0

FILE: Number of write operations=0

HDFS: Number of bytes read=4045895793

HDFS: Number of bytes written=5691

HDFS: Number of read operations=114

HDFS: Number of large read operations=0

HDFS: Number of write operations=2

Job Counters

Launched map tasks=37

Launched reduce tasks=1

Other local map tasks=9

Data-local map tasks=21

Rack-local map tasks=7

Total time spent by all maps in occupied slots (ms)=2263728

Total time spent by all reduces in occupied slots (ms)=1483580

Total time spent by all map tasks (ms)=1131864

Total time spent by all reduce tasks (ms)=741790

Total vcore-milliseconds taken by all map tasks=1131864

Total vcore-milliseconds taken by all reduce tasks=741790

Total megabyte-milliseconds taken by all map tasks=1738543104

Total megabyte-milliseconds taken by all reduce tasks=1519185920

Map-Reduce Framework

Map input records=107556969

Map output records=106767613

Map output bytes=3175717524

Map output materialized bytes=3389252972

Input split bytes=4736

Combine input records=0

Combine output records=0

Reduce input groups=6675

Reduce shuffle bytes=3389252972

Reduce input records=106767613

Reduce output records=137

Spilled Records=213535226

Shuffled Maps =37

Failed Shuffles=0

Merged Map outputs=37

GC time elapsed (ms)=118858

CPU time spent (ms)=1822710

Physical memory (bytes) snapshot=45491015680 Virtual memory (bytes) snapshot=124659118080 Total committed heap usage (bytes)=45830635520

Shuffle Errors

BAD ID=0

CONNECTION=0

IO ERROR=0

WRONG LENGTH=0

WRONG MAP=0

WRONG REDUCE=0

File Input Format Counters

Bytes Read=4045891057

File Output Format Counters

Bytes Written=5691

18/04/24 21:55:34 INFO streaming. StreamJob: Output directory: result4.csv

```
Average TMAX
                        175.588292003
Average TMIN
Max TMAX
                         44.3070463878
                        522
Min TMIN
                         -578
Hottest Weather Stations
Coldest Weather Stations
                                                 ['USC00042319', 'USW00003104',
                                                                                                'USR0000AHAV',
                                                                                                                        'USC00021050',
                                                 ['USC00508140',
                                                                        'USW00026440'.
                                                                                                'USC00502350',
                                                                                                                       'USC00505644',
                                                                                                                                              'USC00501684']
Average TMAX
Average TMIN
Max TMAX
Min TMIN
                        178.750696444
                        47.9236989653
528
Min TMIN -528
Hottest Weather Stations
                                                 ['USC00042319', 'USR0000AHAV', 'USC00024829', 'USC00021050', ['USR0000ABCA', 'USC00508470', 'USS0051R01S', 'USW00026508',
Coldest Weather Stations
                                                                                                                                              'USC00504567']
Average TMAX
                        177,236456277
Average TMIN
Max TMAX
                         46.5543622476
                        533
Min TMIN -472
Hottest Weather Stations
Coldest Weather Stations
                                                    USR0000CMOJ', 'USC00042319',
                                                                                                'USC00265846',
                                                                                                                       'USC00044297'.
                                                 ['USR0000ABEV'. 'USC00503212'. 'USS0050S01S'. 'USC00501684'.
                                                                                                                                              'USW00026533'1
Average TMAX
                        177.095243712
Average TMIN 48.62549
Max TMAX 533
Min TMIN -500
Hottest Weather Stations
                        48.6254930721
533
                                                 ['USC00021050', 'USR0000CMEA', 'USR0000AHAV', 'USC00029376', 'USC00042319']
['USS0050801S', 'USC00501492', 'USC00509869', 'USS0051R01S', 'USW00026533']
Coldest Weather Stations
Average TMAX
Average TMIN
Max TMAX
Min TMIN
                        174.977019472
                        49.5550436384
517
                         -533
Hottest Weather Stations
Coldest Weather Stations
                                                 ['USC00042319', 'USW00053139', 'USC00261371', 'USC00021050', ['USC00501684', 'USC00502568', 'USS0045010S', 'USW00026412',
                                                                                                                                              'USC00503009'1
Average TMAX
Average TMIN
[Max TMAX
[Min TMIN
                        177.906124277
                         49.9807911967
                        539
                         -550
                                                 ['USW00023179', 'USC00042319', 'USR0000CMOJ', 'USW00053139', 'USC00029376']
['USW00026412', 'USC00509869', 'USC00509313', 'USC00502568', 'USC00501684']
Hottest Weather Stations
Coldest Weather Stations
Average TMAX
                        181.089305009
Average TMIN
Max TMAX
Min TMIN
                        51.1208690005
528
                         -528
Hottest Weather Stations
Coldest Weather Stations
                                                 ['USS0051R01S', 'USC00501492', 'USR0000ACHL', 'USR0000ABEV', 'USR0000ASEL']
Average TMAX
                        178.436573222
Average TMIN
Max TMAX
                        49.2221651922
556
Min TMIN
                         -539
Hottest Weather Stations
Coldest Weather Stations
                                                 ['USW00053139', 'USR0000AHAV', 'USR0000CSAW', 'USC00021050', 'USC00042319']
['USR0000ACHL', 'USC00502607', 'USW00026422', 'USC00501684', 'USS0045R01S']
Average TMAX
                        170.391174208
Average TMIN
Max TMAX
                         40.9317958853
                        528
Min TMIN -578
Hottest Weather Stations
                                                 ['USC00261371', 'USC00042319', 'USC00024761', 'USC00044297', 'USW00053139']
['USS0045R01S', 'USR0000ACHL', 'USR0000ABEV', 'USC00501684', 'USC00501492']
Coldest Weather Stations
```

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2009
Average TMAX
                     169,166144748
Average TMIN
                      43.7016440406
Max TMAX
Min TMIN
                      -556
                                           ['USW00053139', 'USR0000CSQU', 'USR0000CBUU', 'USC00042319', 'USR0000CMOJ']
['USC00502101', 'USC00501684', 'USC00509313', 'USR0000AEAG', 'USW00026412']
Hottest Weather Stations
Coldest Weather Stations
2010
Average TMAX
                     171.781345009
Average TMIN
                      47.4745365367
Max TMAX
                     517
Min TMIN
                     -533
Hottest Weather Stations
Coldest Weather Stations
                                           ['USC00021050', 'USR0000AHAV', 'USR0000CBUU', 'USC00042319', 'USR0000CMOJ']
['USC00501684', 'USR0000ACHL', 'USS0045R01S', 'USS0051R01S', 'USC00502101']
2011
Average TMAX
                      172.779375228
Average TMIN
                      46.29123543
Max TMAX
Min TMIN
                     511
                     -517
                                           ['USC00042319', 'USR0000CCAA', 'USW00053139', 'USR0000CBUU', 'USC00022782']
['USC00509869', 'USC00501492', 'USS0051R01S', 'USC00501684', 'USR0000ANOR']
Hottest Weather Stations
Coldest Weather Stations
2012
Average TMAX
Average TMIN
                      184.466143175
                     53.8746350331
Max TMAX
                     537
Min TMIN
                      -544
Hottest Weather Stations
                                           ['USW00053139', 'USR0000AHAV', 'USC00021050', 'USS0005N23S', 'USC00042319']
['USC00504210', 'USC00503165', 'USS0051R01S', 'USS0045R01S', 'USC00503212']
Coldest Weather Stations
2013
                     168,028435001
Average TMAX
Average TMIN
                      43.535081883
Max TMAX
                     539
Min TMIN
                      -528
                                           ['USW00053139', 'USW00004134', 'USR0000AHAV', 'USC00044297', 'USC00042319']
Hottest Weather Stations
Coldest Weather Stations
                                           ['USS0051R01S', 'USS0045004S', 'USS0045R01S', 'USC00502339', 'USC00501684']
2014
Average TMAX
                      169,243107388
Average TMIN
                      44.3185744368
Max TMAX
                     522
Min TMIN
                      -500
Hottest Weather Stations
                                           ['USW00053139', 'USC00042319', 'USC00028396', 'USW00003125', 'USS0009S04S']
['USC00501684', 'USR0000ABCK', 'USS0048V01S', 'USS0051R01S', 'USS0045R01S']
Coldest Weather Stations
Average TMAX
                      178.058197184
Average TMIN
                      54.0433479213
Max TMAX
                     556
Min TMIN
                      -528
                                           ['USW00053139', 'USR0000CBUU', 'USW00003104', 'USC00045502', 'USC00042319']
['USS0041P07S', 'USC00509314', 'USW00026533', 'USC00501684', 'USS0045R01S']
Hottest Weather Stations
Coldest Weather Stations
2016
Average TMAX
                      179.871720866
Average TMIN
                     55.5845140688
Max TMAX
                     539
Min TMIN
                      -469
                                           ['USC00042319', 'USW00023179', 'USC00040924', 'USW00053139', 'USR0000CBEV']
['USR0000ALOS', 'USC00501684', 'USR0000ACHL', 'USS0045R01S', 'USS0041P07S']
Hottest Weather Stations
Coldest Weather Stations
2017
Average TMAX
                     176,566692563
Average TMIN
                     52.6928672336
Max TMAX
                     528
Min TMIN
                     -520
                                           ['USW00053139', 'USC00021050', 'USW00023179', 'USC00046386', 'USC00042319']
['USR0000ASLC', 'USS0051R01S', 'USS0045004S', 'USW00026529', 'USR0000ALIV']
Hottest Weather Stations
Coldest Weather Stations
```

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2018
          Average TMAX
                              78.8660958193
2018
          Average TMIN
                              -37.3588068434
2018
          Max TMAX
                              400
          Min TMIN
2018
                              -528
                                                  ['USC00417624', 'USC00411524', 'USR0000CCAA', 'USW00012959', 'USR0000TFAL']
['USW00096406', 'USR0000AKAV', 'USR0000ANOR', 'USW00026529', 'USC00502339']
2018
          Hottest Weather Stations
2018
          Coldest Weather Stations
Hottest Day
                    20071013
                                         - StationID
                                                            USR0000CSAW
Coldest Day
                   20000101
                                         - StationID
                                                            USC00501684
```