ApplyFamilyFunctions

December 23, 2017

1 Project Overview

You are working on a project for a metorology beureau. You have been supplied weather data for 4 cities in the US: Chicago, New York, Houston, and San Franciso.

You are required to deliver the following outputs:

- A table showing the annual averages of each observed metric for every city
- A table showing by how much temperature fluctuates each month from min to max in percent. Take min temp as the base.
- A table showing the annual maximums of each observed metric for each city
- A table showing the annual minimums of each observed metric for each city
- A table showing in which months the annual maximums of each metric were observed in every city.

In this section we will cover:

- 1. How the apply family of functions works
- 2. How to recreate the apply statement with a for loop
- 3. when to apply, lapply, or sapply
- 4. How to combine lapply with []
- 5. How to nest your own functions in apply type functions
- 6. How to nest apply type functions within each other
- 7. How to use the which.max and which.min functions

2 Import the dataset

```
In [7]: Chicago = read.csv("Chicago-F.csv", row.names = 1)
    NewYork = read.csv("NewYork-F.csv", row.names = 1)
    Houston = read.csv("Houston-F.csv", row.names = 1)
    SanFran = read.csv("SanFran-F.csv", row.names = 1)
```

In [9]: Chicago

	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct
AvgHigh_F	32.00	36.00	46.00	59.00	70.00	81.00	84.00	82.00	75.00	63.00
AvgLow_F	18.00	21.00	30.00	41.00	52.00	63.00	68.00	66.00	57.00	46.00
AvgPrecip_inch	2.05	1.93	2.72	3.62	4.13	4.06	4.02	3.98	3.31	3.23
DaysWithPrecip	10.00	8.00	11.00	11.00	11.00	10.00	9.00	9.00	8.00	10.00
HoursOfSunshine	135.00	136.00	187.00	215.00	281.00	311.00	318.00	283.00	226.00	193.00

In [10]: NewYork

	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	N
AvgHigh_F	39.0	42.00	50.00	60.00	71.00	79.0	85.00	83.00	76.00	65.00	54
AvgLow_F	26.0	29.00	35.00	44.00	55.00	64.0	70.00	69.00	61.00	50.00	41
AvgPrecip_inch	3.9	2.95	4.06	3.94	4.45	3.5	4.53	4.13	3.98	3.39	3.
DaysWithPrecip	11.0	10.00	12.00	11.00	11.00	10.0	11.00	10.00	8.00	8.00	9.
HoursOfSunshine	154.0	171.00	213.00	237.00	268.00	289.0	302.00	271.00	235.00	213.00	16

In [11]: Houston

	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct
AvgHigh_F	63.00	66.00	73.00	80.00	86.00	91.00	94.00	94.00	90.00	82.00
AvgLow_F	43.00	47.00	53.00	59.00	68.00	74.00	75.00	75.00	70.00	61.00
AvgPrecip_inch	3.35	3.19	3.39	3.31	5.08	5.91	3.78	3.74	4.09	5.67
DaysWithPrecip	9.00	9.00	8.00	6.00	8.00	10.00	9.00	8.00	8.00	7.00
HoursOfSunshine	142.00	155.00	192.00	210.00	248.00	282.00	294.00	269.00	237.00	229.00

In [12]: SanFran

	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov
AvgHigh_F	57.00	60.00	62.00	63.00	64.00	66.00	67	68.00	70.0	69.0	63.0
AvgLow_F	46.00	47.00	49.00	49.00	51.00	53.00	54	55.00	55.0	54.0	50.0
AvgPrecip_inch	4.49	4.45	3.27	1.46	0.71	0.16	0	0.08	0.2	1.1	3.15
DaysWithPrecip	11.00	11.00	10.00	6.00	4.00	2.00	1	1.00	1.0	4.0	7.00
HoursOfSunshine	165.00	182.00	251.00	281.00	314.00	330.00	300	272.00	267.0	243.0	189.

2.1 Let's convert these to matrices

DaysWithPrecip | 11.0

2.2 Let's make a list

In [15]: Weather = list(Chicago = Chicago, NewYork = NewYork, Houston = Houston, SanFran = SanFr
Weather

		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	C
-	AvgHigh_F	32.00	36.00	46.00	59.00	70.00	81.00	84.00	82.00	75.00	6
¢Chicago	AvgLow_F	18.00	21.00	30.00	41.00	52.00	63.00	68.00	66.00	57.00	4
\$Chicago	AvgPrecip_inch	2.05	1.93	2.72	3.62	4.13	4.06	4.02	3.98	3.31	3
	DaysWithPrecip	10.00	8.00	11.00	11.00	11.00	10.00	9.00	9.00	8.00	1
	HoursOfSunshine	135.00	136.00	187.00	215.00	281.00	311.00	318.00	283.00	226.00	1
		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	O
	AvgHigh_F	39.0	42.00	50.00	60.00	71.00	79.0	85.00	83.00	76.00	65
¢NioruVoule	AvgLow_F	26.0	29.00	35.00	44.00	55.00	64.0	70.00	69.00	61.00	50
\$NewYork	AvgPrecip_inch	3.9	2.95	4.06	3.94	4.45	3.5	4.53	4.13	3.98	3.3

12.00

HoursOfSunshine | 154.0 171.00 213.00 237.00 268.00 289.0 302.00 271.00

11.00

11.00

10.0

11.00

10.00

8.00

235.00 21

10.00

		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	; Se	р (
	AvgHigh_F	63.00	66.00	73.00	80.00	86.00	91.00	94.00	94.0	0 90	.00.
\$Houston	AvgLow_F	43.00	47.00	53.00	59.00	68.00	74.00	75.00	75.0	0 70	.00 6
\$110 usto11	AvgPrecip_inch	3.35	3.19	3.39	3.31	5.08	5.91	3.78	3.74	4.0)9 5
	DaysWithPrecip	9.00	9.00	8.00	6.00	8.00	10.00	9.00	8.00	8.0	00 7
	HoursOfSunshine	142.00	155.00	192.00	210.00	248.00	282.00	294.0	00 269.	00 23	7.00 2
		•									
	1		_					_		_	_
		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct
	AvgHigh_F	Jan 57.00	Feb 60.00	Mar 62.00	Apr 63.00	May 64.00	Jun 66.00	Jul 67	Aug 68.00	Sep 70.0	Oct 69.0
& Can Eran	AvgHigh_F AvgLow_F										
\$SanFran	0 0	57.00	60.00	62.00	63.00	64.00	66.00	67	68.00	70.0	69.0
\$SanFran	AvgLow_F	57.00 46.00	60.00 47.00	62.00 49.00	63.00 49.00	64.00 51.00	66.00 53.00	67 54	68.00 55.00	70.0 55.0	69.0 54.0
\$SanFran	AvgLow_F AvgPrecip_inch	57.00 46.00 4.49	60.00 47.00 4.45	62.00 49.00 3.27	63.00 49.00 1.46	64.00 51.00 0.71	66.00 53.00 0.16	67 54	68.00 55.00 0.08	70.0 55.0 0.2	69.0 54.0 1.1 4.0

3 Using apply()

```
In [16]: apply(Chicago, 1, mean)
```

```
In [17]: apply(Chicago, 1, max)
```

AvgHigh_F 84 AvgLow_F 68 AvgPrecip_inch 4.13 DaysWithPrecip 11 HoursOfSunshine 318

```
In [18]: apply(Chicago, 1, min)
```

AvgHigh_F 32 AvgLow_F 18 AvgPrecip_inch 1.93 DaysWithPrecip 8 HoursOfSunshine 106

4 Recreating the apply function with loops

4.1 Find the mean of every row

4.2 Find the max of every row

AvgHigh_F 84 AvgLow_F 68 AvgPrecip_inch 4.13 DaysWithPrecip 11 HoursOfSunshine 318

4.3 Find the min of every row

 $\label{lem:avgHigh} \textbf{AvgHigh} \ \textbf{_F 32 AvgLow} \ \textbf{_F 18 AvgPrecip} \ \textbf{_inch 1.93 DaysWithPrecip 8 HoursOfSunshine 106}$

5 Using lapply()

		AvgHigh_F	AvgLow_F	AvgPrecip_inch	DaysWithPrecip	HoursOfSunshine
	Jan	32	18	2.05	10	135
	Feb	36	21	1.93	8	136
	Mar	46	30	2.72	11	187
	Apr	59	41	3.62	11	215
	May	70	52	4.13	11	281
\$Chicago	Jun	81	63	4.06	10	311
	Jul	84	68	4.02	9	318
	Aug	82	66	3.98	9	283
	Sep	75	57	3.31	8	226
	Oct	63	46	3.23	10	193
	Nov	48	34	3.43	11	113
	Dec	36	23	2.56	11	106

		AvgHigh_F	AvgLow_F	AvgPrecip_inch	DaysWithPrecip	HoursOfSunshine
	Jan	39	26	3.90	11	154
	Feb	42	29	2.95	10	171
	Mar	50	35	4.06	12	213
	Apr	60	44	3.94	11	237
	May	71	55	4.45	11	268
\$NewYork	Jun	79	64	3.50	10	289
	Jul	85	70	4.53	11	302
	Aug	83	69	4.13	10	271
	Sep	76	61	3.98	8	235
	Oct	65	50	3.39	8	213
	Nov	54	41	3.82	9	169
	Dec	44	32	3.58	10	155
				. D 1	D WAD	II 0/0 1:
		AvgHigh_F	AvgLow_F	AvgPrecip_inch	DaysWithPrecip	HoursOfSunshine
	Jan	63	43	3.35	9	142
	Feb	66	47	3.19	9	155
	Mar	73	53	3.39	8	192
	Apr	80	59	3.31	6	210
	May	86	68	5.08	8	248
\$Houston	Jun	91	74	5.91	10	282
	Jul	94	75	3.78	9	294
	Aug	94	75	3.74	8	269
	Sep	90	70	4.09	8	237
	Oct	82	61	5.67	7	229
	Nov	73	52	4.33	8	168
	Dec	64	45	3.74	9	148
		AvgHigh_F	AvgLow_F	AvgPrecip_inch	DaysWithPrecip	HoursOfSunshine
	Jan	57	46	4.49	11	165
	Feb	60	47	4.45	11	182
	Mar	62	49	3.27	10	251
	Apr	63	49	1.46	6	281
	May	64	51	0.71	4	314
\$SanFran	Jun	66	53	0.16	2	330
	Jul	67	54	0.00	1	300
	Aug	68	55	0.08	1	272
	Sep	70	55	0.20	1	267
	Oct	69	54	1.10	4	243
	Nov	63	50	3.15	7	189
	Dec	57	46	4.57	10	156

5.1 Combining lapply() with []

In [27]: Weather

		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	C
-	AvgHigh_F	32.00	36.00	46.00	59.00	70.00	81.00	84.00	82.00	75.00	6
\$Chicago	AvgLow_F	18.00	21.00	30.00	41.00	52.00	63.00	68.00	66.00	57.00	4
\$Cilicago	AvgPrecip_inch	2.05	1.93	2.72	3.62	4.13	4.06	4.02	3.98	3.31	3
	DaysWithPrecip	10.00	8.00	11.00	11.00	11.00	10.00	9.00	9.00	8.00	1
	HoursOfSunshine	135.00	136.00	187.00	215.00	281.00	311.00	318.00	283.00	226.0	0 1
	·	l -	T. 1	3.6		3.6	т	т 1		C	
		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	00
	AvgHigh_F	1	42.00	50.00	60.00	71.00	79.0	85.00	83.00	76.00	65
\$NewYork	AvgLow_F	26.0	29.00	35.00	44.00	55.00	64.0	70.00	69.00	61.00	50
φιτοιν Ισικ	AvgPrecip_inch	3.9	2.95	4.06	3.94	4.45	3.5	4.53	4.13	3.98	3.3
	DaysWithPrecip	11.0	10.00	12.00	11.00	11.00	10.0	11.00	10.00	8.00	8.0
	HoursOfSunshine	154.0	171.00	213.00	237.00	268.00	289.0	302.00	271.00	235.00	21
		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	(
	AvgHigh_F	63.00	66.00	73.00	80.00	86.00	91.00	94.00		90.00) 8
¢II ozrato z	AvgLow_F	43.00	47.00	53.00	59.00	68.00	74.00	75.00	75.00	70.00) 6
\$Houston	AvgPrecip_inch	3.35	3.19	3.39	3.31	5.08	5.91	3.78	3.74	4.09	5
	DaysWithPrecip	9.00	9.00	8.00	6.00	8.00	10.00	9.00	8.00	8.00	7
	HoursOfSunshine	142.00	155.00	192.00	210.00	248.00	282.00	294.0	269.00	237.0	0 2
		Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep (Oct
-	AvgHigh_F	57.00	60.00	62.00	63.00	64.00	66.00				59.0
фС Г	AvgLow_F	46.00	47.00	49.00	49.00	51.00	53.00			55.0	54.0
\$SanFran	AvgPrecip_inch	4.49	4.45	3.27	1.46	0.71	0.16	0	0.08	0.2	1.1
	DaysWithPrecip	11.00	11.00	10.00	6.00	4.00	2.00	1	1.00	1.0	4.0
	Day 5 (Tall Teelp										
	HoursOfSunshine	165.00	182.00	251.00	281.00	314.00	330.00				243.0

In [24]: lapply(Weather,"[",1,1)

\$Chicago 32

\$NewYork 39

\$Houston 63

\$SanFran 57

In [25]: lapply(Weather,"[",1)

\$Chicago 32

\$NewYork 39

\$Houston 63

\$SanFran 57

In [26]: lapply(Weather,"[",,1)

\$Chicago AvgHigh_F 32 AvgLow_F 18 AvgPrecip_inch 2.05 DaysWithPrecip 10 HoursOfSunshine 135

39 AvgLow_F 26 AvgPrecip_inch 3.9 DaysWithPrecip \$NewYork AvgHigh_F 11 **HoursOfSunshine** 154 3.35 DaysWithPrecip 9 \$Houston AvgHigh_F 63 AvgLow_F 43 AvgPrecip_inch **HoursOfSunshine** 142 \$SanFran AvgHigh_F 57 AvgLow_F 46 AvgPrecip_inch 4.49 DaysWithPrecip 11 HoursOfSunshine 165

6 Adding your own functions

In [28]: lapply(Weather, rowMeans)

- \$\text{Houston AvgHigh}_F \quad 79.666666666667 \text{AvgLow}_F \quad 60.16666666667 \text{AvgPrecip}_inch \\ 4.13166666666667 \text{DaysWithPrecip} \quad 8.25 \text{HoursOfSunshine} \quad 214.5

In [29]: lapply(Weather, function(x)x[1,])

- \$Chicago Jan 32 Feb 36 Mar 46 Apr 59 May 70 Jun 81 Jul 84 Aug 82 Sep 75 Oct 63 Nov 48 Dec 36
- **\$NewYork** Jan 39 Feb 42 Mar 50 Apr 60 May 71 Jun 79 Jul 85 Aug 83 Sep 76 Oct 65 Nov 54 Dec 44
- \$Houston Jan 63 Feb 66 Mar 73 Apr 80 May 86 Jun 91 Jul 94 Aug 94 Sep 90 Oct 82 Nov 73 Dec 64
- \$SanFran Jan 57 Feb 60 Mar 62 Apr 63 May 64 Jun 66 Jul 67 Aug 68 Sep 70 Oct 69 Nov 63 Dec 57

In [30]: lapply(Weather, function(x)x[5,])

- \$Chicago Jan 135 Feb 136 Mar 187 Apr 215 May 281 Jun 311 Jul 318 Aug 283 Sep 226 Oct 193 Nov 113 Dec 106
- \$NewYork Jan 154 Feb 171 Mar 213 Apr 237 May 268 Jun 289 Jul 302 Aug 271 Sep 235 Oct 213 Nov 169 Dec 155
- \$Houston Jan 142 Feb 155 Mar 192 Apr 210 May 248 Jun 282 Jul 294 Aug 269 Sep 237 Oct 229 Nov 168 Dec 148
- \$SanFran Jan 165 Feb 182 Mar 251 Apr 281 May 314 Jun 330 Jul 300 Aug 272 Sep 267 Oct 243
 Nov 189 Dec 156

In [31]: lapply(Weather, function(x)x[,12])

```
23 AvgPrecip\_inch
                                                              2.56 DaysWithPrecip
$Chicago AvgHigh\_F
                        36 AvgLow\_F
                                                                                     11
     HoursOfSunshine
                                                     106
$NewYork AvgHigh\_F
                         44 AvgLow\_F
                                         32 AvgPrecip\_inch
                                                               3.58 DaysWithPrecip
                                                                                     10
     HoursOfSunshine
                                                     155
$Houston AvgHigh\_F
                         64 AvgLow\_F
                                          45 AvgPrecip\_inch
                                                               3.74 DaysWithPrecip
                                                                                      9
     HoursOfSunshine
                                                     148
$SanFran AvgHigh\ F
                        57 AvgLow\ F
                                         46 AvgPrecip\_inch
                                                               4.57 DaysWithPrecip
                                                                                     10
     HoursOfSunshine
In [32]: lapply(Weather, function(x)x[1,]-x[2,])
$Chicago Jan 14 Feb 15 Mar 16 Apr 18 May 18 Jun 18 Jul 16 Aug 16 Sep 18 Oct 17 Nov 14 Dec 13
$NewYork Jan 13 Feb 13 Mar 15 Apr 16 May 16 Jun 15 Jul 15 Aug 14 Sep 15 Oct 15 Nov 13 Dec
$Houston Jan 20 Feb 19 Mar 20 Apr 21 May 18 Jun 17 Jul 19 Aug 19 Sep 20 Oct 21 Nov 21 Dec
     19
$SanFran Jan 11 Feb 13 Mar 13 Apr 14 May 13 Jun 13 Jul 13 Aug 13 Sep 15 Oct 15 Nov 13 Dec 11
In [33]: lapply(Weather, function(x) round((
             x[1,]-x[2,])/x[2,],2))
$Chicago Jan 0.78 Feb 0.71 Mar 0.53 Apr 0.44 May 0.35 Jun 0.29 Jul 0.24 Aug 0.24 Sep 0.32 Oct
     0.37 Nov
                                  0.41 Dec
                                                               0.57
$NewYork Jan 0.5 Feb 0.45 Mar 0.43 Apr 0.36 May 0.29 Jun 0.23 Jul 0.21 Aug 0.2 Sep 0.25 Oct
     0.3 Nov
                                  0.32 Dec
                                                               0.38
$Houston Jan 0.47 Feb 0.4 Mar 0.38 Apr 0.36 May 0.26 Jun 0.23 Jul 0.25 Aug 0.25 Sep 0.29 Oct
                                   0.4 Dec
$SanFran Jan 0.24 Feb 0.28 Mar 0.27 Apr 0.29 May 0.25 Jun 0.25 Jul 0.24 Aug 0.24 Sep 0.27 Oct
     0.28 Nov
                                  0.26 Dec
                                                               0.24
   Using sapply()
In [34]: lapply(Weather, "[",1,7)
$Chicago 84
$NewYork 85
$Houston 94
$SanFran 67
```

In [35]: sapply(Weather, "[",1,7)

Chicago	84 NewYork	85	Houston	94 \$	SanFran	67	
In [36]: lapply(We	eather, "[",1	,10:12)					
\$Chicago Oct	63 N	lov	48	Dec	36		
\$NewYork Oct	65	Nov	54	4 Dec	44		
\$Houston Oct	82 N	Nov	7 3	B Dec	64		
\$SanFran Oct	69 N	Nov	63	Dec	57		
In [37]: sapply(We	eather, "[",1	,10:12)					
Chicago Oct 63 Nov 48 Dec 36 In [38]: sapply(We #Same and same an	65 8 54 7 44 6 eather, rowMe s lapply _F 59.33333333 ip 9.9166 h_F 62.33 ip 10.083 ip 10.083	32 673 673 673 674 574 575 675 675 675 675 675 675 675 675 675	gLow_F 43 7 HoursOfs 33 AvgLow\ 3 HoursOfs AvgLow_l	3.25 AvgPre Sunshine _F 48 A Sunshine F 60.1666 oursOfSun	208.666666 AvgPrecip_in 223.08333 6666666667 Avg	6666667 ch 3.8 3333333 gPrecip_ 214.5 inch	3525
8 Nesting Ap	ply Functio	ons					
\$Chicago AvgHigh HoursOfSuns	_	Low_F	68 AvgPrec	ip∖_inch 318	4.13 DaysWit	hPrecip	11
\$NewYork AvgHigh	_	Low_F	70 AvgPre	cip_inch 302	4.53 DaysWit	thPrecip	12
\$Houston AvgHigh HoursOfSuns	_	Low_F	75 AvgPred	ip_inch 294	5.91 DaysWit	hPrecip	10
\$SanFran AvgHigh HoursOfSuns		Low_F	55 AvgPre c	ip∖_inch 330	4.57 DaysWit	hPrecip	11

In [41]: lapply(Weather, function(x) apply(x,1,max))

```
4.13 DaysWithPrecip
$Chicago AvgHigh\_F
                       84 AvgLow\_F
                                       68 AvgPrecip\_inch
                                                                                11
    HoursOfSunshine
                                                  318
$NewYork AvgHigh\_F
                        85 AvgLow\_F
                                       70 AvgPrecip\_inch
                                                           4.53 DaysWithPrecip
                                                                                12
    HoursOfSunshine
                                                  302
$Houston AvgHigh\_F
                       94 AvgLow\_F
                                       75 AvgPrecip\_inch
                                                           5.91 DaysWithPrecip
                                                                                10
    HoursOfSunshine
                                                  294
$SanFran AvgHigh\_F
                       70 AvgLow\_F
                                       55 AvgPrecip\_inch
                                                           4.57 DaysWithPrecip
                                                                                11
    HoursOfSunshine
```

9 which.max() and which.min()

```
In [42]: which.max(Chicago[1,])
   Jul: 7
In [43]: names(which.max(Chicago[1,]))
   'Jul'
In [46]: apply(Chicago,1,function(x) names(which.max(x)))
```

AvgHigh_F 'Jul' AvgLow_F 'Jul' AvgPrecip_inch 'May' DaysWithPrecip 'Mar' HoursOfSunshine 'Jul'

```
In [47]: lapply(Weather, function(y) apply(y,1,function(x) names(which.max(x))))
```

- \$Chicago AvgHigh_F 'Jul' AvgLow_F 'Jul' AvgPrecip_inch 'May' DaysWithPrecip 'Mar' HoursOfSunshine 'Jul'
- \$NewYork AvgHigh_F 'Jul' AvgLow_F 'Jul' AvgPrecip_inch 'Jul' DaysWithPrecip 'Mar' HoursOfSunshine 'Jul'
- \$Houston AvgHigh_F 'Jul' AvgLow_F 'Jul' AvgPrecip_inch 'Jun' DaysWithPrecip 'Jun' HoursOfSunshine 'Jul'
- \$SanFran AvgHigh_F 'Sep' AvgLow_F 'Aug' AvgPrecip_inch 'Dec' DaysWithPrecip 'Jan' HoursOfSunshine 'Jun'

Now we have the max months for each city!