Missingness Imputation

Code ▼

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```
library(quantmod)
library(magrittr)
library(VIM)
library(DMwR)
library(FNN)
```

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```
start <- as.Date("2020-03-01")
end <- as.Date("2020-06-02")
```

According to the assignment requirements on the slides, I need to get Dow Jones index and 10 more companies data. Since they all used abbreviations on Yahoo finance, I will write their names down here. They are Apple, Goldman Sachs, Microsoft, Snapchat, Boeing, Google, Amazon, JP Morgan Chase, Alibaba and Nike.

```
getSymbols(c("^DJI", "AAPL", "GS", "MSFT", "SNAP", "BA", "GOOG", "AMZN", "JPM", "BABA", "NKE"),
src = "yahoo", from = start, to = end)
```

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```
stocks <- as.xts(data.frame(DJI = DJI[, "DJI.Close"], AAPL = AAPL[, "AAPL.Close"], GS = GS[, "G
S.Close"], MSFT = MSFT[, "MSFT.Close"], SNAP = SNAP[, "SNAP.Close"], BA = BA[, "BA.Close"], GOOG
= GOOG[, "GOOG.Close"], AMZN = AMZN[, "AMZN.Close"], JPM = JPM[, "JPM.Close"], BABA = BABA[, "BA
BA.Close"], NKE = NKE[, "NKE.Close"]))</pre>
```

The reason why the Date begins with '2020-03-02' because '2020-03-01' is a Saturday, stock market closes on weekends, holidays and meltdown. I think this also the part of the reason we need to find out missing data.

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head(stocks)

	DJI.Close	AAPL.Close	${\tt GS.Close}$	${\tt MSFT.Close}$	${\tt SNAP.Close}$	${\tt BA.Close}$	GOOG.Close	AMZN.Close JP	
M.Close									
2020-03-02	26703.32	298.81	209.47	172.79	14.39	289.27	1389.11	1953.95	
121.52									
2020-03-03	25917.41	289.32	203.43	164.51	13.55	280.62	1341.39	1908.99	
116.96									
2020-03-04	27090.86	302.74	208.74	170.55	13.63	283.12	1386.52	1975.83	
119.85									
2020-03-05	26121.28	292.92	198.79	166.27	13.85	260.37	1319.04	1924.03	
113.97									
2020-03-06	25864.78	289.03	192.85	161.57	13.00	262.33	1298.41	1901.09	
108.08									
2020-03-09	23851.02	266.17	172.81	150.62	11.45	227.17	1215.56	1800.61	
93.44									
	BABA.Close	e NKE.Close							
2020-03-02	210.98	92.68							
2020-03-03	207.41	1 90.93							
2020-03-04	211.96	5 93.79							
2020-03-05	211.46								
2020-03-06	204.64								
2020-03-09	197.66	5 84.11							

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summary(stocks)

```
Index
                                 DJI.Close
                                                   AAPL.Close
                                                                     GS.Close
                                                                                    MSFT.Close
                                       :18592
                                                                         :135.0
Min.
       :2020-03-02 00:00:00
                               Min.
                                                Min.
                                                        :224.4
                                                                 Min.
                                                                                  Min.
                                                                                          :135.4
                                                                 1st Qu.:164.2
1st Qu.:2020-03-23 18:00:00
                               1st Qu.:22628
                                                1st Qu.:259.2
                                                                                  1st Qu.:157.3
Median :2020-04-15 12:00:00
                               Median :23702
                                                Median :283.8
                                                                 Median :177.1
                                                                                  Median :171.7
Mean
       :2020-04-15 04:34:41
                               Mean
                                       :23408
                                                Mean
                                                        :281.5
                                                                 Mean
                                                                         :175.0
                                                                                  Mean
                                                                                          :167.7
3rd Qu.:2020-05-07 06:00:00
                                3rd Ou.:24376
                                                3rd Qu.:304.7
                                                                 3rd Qu.:183.5
                                                                                  3rd Qu.:180.9
Max.
       :2020-06-01 00:00:00
                               Max.
                                       :27091
                                                Max.
                                                        :321.9
                                                                 Max.
                                                                         :209.7
                                                                                  Max.
                                                                                          :186.7
                                     GOOG.Close
                                                     AMZN.Close
                                                                     JPM.Close
  SNAP.Close
                    BA.Close
                                                                                       BABA.Close
Min.
       : 8.37
                Min.
                        : 95.01
                                  Min.
                                          :1057
                                                   Min.
                                                          :1677
                                                                  Min.
                                                                          : 79.03
                                                                                    Min.
                                                                                            :176.3
1st Qu.:11.88
                1st Qu.:128.85
                                  1st Qu.:1181
                                                   1st Qu.:1909
                                                                  1st Qu.: 88.95
                                                                                     1st Qu.:194.4
                                                  Median :2297
                                                                  Median : 91.52
Median :13.62
                Median :138.37
                                  Median :1276
                                                                                    Median :200.0
Mean
       :14.32
                Mean
                        :150.84
                                  Mean
                                          :1267
                                                  Mean
                                                          :2162
                                                                  Mean
                                                                          : 93.63
                                                                                    Mean
                                                                                            :199.3
3rd Qu.:17.34
                3rd Qu.:151.50
                                                                   3rd Qu.: 95.86
                                   3rd Qu.:1373
                                                   3rd Qu.:2395
                                                                                     3rd Qu.:206.6
       :19.55
                        :289.27
                                          :1432
                                                          :2498
                                                                          :121.52
                                                                                            :217.2
Max.
                Max.
                                  Max.
                                                   Max.
                                                                  Max.
                                                                                    Max.
  NKE.Close
       :62.80
Min.
1st Qu.:84.08
Median :87.08
       :85.61
Mean
3rd Qu.:90.05
Max.
       :99.87
```

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```
stocks1 <- knnImputation(stocks, k = 3, scale = T, meth = "median", distData = NULL)</pre>
```

No case has missing values. Stopping as there is nothing to do.

I checked 'median' column as a example by using knnlmputation function. It shows there is no missing values, so we need to check other columns for example 'Date'. First oF all, we need to add index as a variable in the dataset.

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```
stocks <- as.data.frame(stocks)
stocks$Date <- row.names(stocks)
cln <- ncol(stocks)
stocks <- stocks[, c(cln, 1:(cln-1))]
row.names(stocks) <- NULL</pre>
```

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head(stocks)

				<dbl></dbl>	<dbl></dbl>	<dbl></dbl>
26703.32	298.81	209.47	172.79	14.39	289.27	1389.11
25917.41	289.32	203.43	164.51	13.55	280.62	1341.39
27090.86	302.74	208.74	170.55	13.63	283.12	1386.52
26121.28	292.92	198.79	166.27	13.85	260.37	1319.04
25864.78	289.03	192.85	161.57	13.00	262.33	1298.41
23851.02	266.17	172.81	150.62	11.45	227.17	1215.56
	25917.41 27090.86 26121.28 25864.78	25917.41 289.32 27090.86 302.74 26121.28 292.92 25864.78 289.03	25917.41 289.32 203.43 27090.86 302.74 208.74 26121.28 292.92 198.79 25864.78 289.03 192.85	25917.41 289.32 203.43 164.51 27090.86 302.74 208.74 170.55 26121.28 292.92 198.79 166.27 25864.78 289.03 192.85 161.57	25917.41 289.32 203.43 164.51 13.55 27090.86 302.74 208.74 170.55 13.63 26121.28 292.92 198.79 166.27 13.85 25864.78 289.03 192.85 161.57 13.00	25917.41 289.32 203.43 164.51 13.55 280.62 27090.86 302.74 208.74 170.55 13.63 283.12 26121.28 292.92 198.79 166.27 13.85 260.37 25864.78 289.03 192.85 161.57 13.00 262.33

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summary(stocks)

Date	DJI.Close	AAPL.Close	GS.Close	MSFT.Close	SNAP.Close
Length:64	Min. :18592	Min. :224.4	Min. :135.0	Min. :135.4	Min. : 8.3
7					
Class :character	1st Qu.:22628	1st Qu.:259.2	1st Qu.:164.2	1st Qu.:157.3	1st Qu.:11.8
8 Mode :character	Median :23702	Madian 1992 0	Modian .177 1	Madian :171 7	Modian 112 (
Mode :character 2	Median :23/02	Median :283.8	Median :177.1	Median :171.7	Median :13.6
2	Mean :23408	Mean :281.5	Mean :175.0	Mean :167.7	Mean :14.3
2					
	3rd Qu.:24376	3rd Qu.:304.7	3rd Qu.:183.5	3rd Qu.:180.9	3rd Qu.:17.3
4					
	Max. :27091	Max. :321.9	Max. :209.7	Max. :186.7	Max. :19.5
5	0000 01		704 63	DADA 63	
BA.Close	GOOG.Close		JPM.Close	BABA.Close	NKE.Close
Min. : 95.01	Min. :1057				in. :62.80
1st Qu.:128.85	1st Qu.:1181	1st Qu.:1909 1s	st Qu.: 88.95 1	st Qu.:194.4 1	st Qu.:84.08
Median :138.37	Median :1276	Median :2297 Me	edian : 91.52 M	edian :200.0 M	edian :87.08
Mean :150.84	Mean :1267	Mean :2162 Me	ean : 93.63 M	ean :199.3 M	ean :85.61
3rd Qu.:151.50	3rd Qu.:1373	3rd Qu.:2395 3r	d Qu.: 95.86 3	rd Qu.:206.6 3	rd Qu.:90.05
Max. :289.27	Max. :1432	Max. :2498 Ma	x. :121.52 M	ax. :217.2 M	ax. :99.87
4					
4					

I realized that the data type of "Date" is not numeric and different than other variables, that's why when I was using knnImputation function gave me 0 missing value. I removed the "Date" column, and use get.knn function on the new dataset. Finally, I got the knn index below.

```
new <- within(stocks, rm("Date"))
new</pre>
```

DJI.Close <dbl></dbl>	AAPL.Clo <dbl></dbl>	GS.Clo <dbl></dbl>	MSFT.Close <dbl></dbl>	SNAP.Close <dbl></dbl>	BA.Clo <dbl></dbl>	GOOG.CI <dbl></dbl>	AMZN.CI <dbl></dbl>	JF
26703.32	298.81	209.47	172.79	14.39	289.27	1389.110	1953.95	
25917.41	289.32	203.43	164.51	13.55	280.62	1341.390	1908.99	
27090.86	302.74	208.74	170.55	13.63	283.12	1386.520	1975.83	
26121.28	292.92	198.79	166.27	13.85	260.37	1319.040	1924.03	
25864.78	289.03	192.85	161.57	13.00	262.33	1298.410	1901.09	
23851.02	266.17	172.81	150.62	11.45	227.17	1215.560	1800.61	
25018.16	285.34	184.35	160.92	11.99	231.01	1280.390	1891.82	
23553.22	275.43	171.89	153.63	10.81	189.08	1215.410	1820.86	
21200.62	248.23	150.68	139.06	10.42	154.84	1114.910	1676.61	
23185.62	277.97	177.17	158.83	11.35	170.20	1219.730	1785.00	
10 of 64 ro	ws 1-9 of 11 c	columns		Previo	us 1 2	3 4 5	6 7 Ne	xt

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get.knn(new, k=5)

\$nn.ir	ndex				
	[,1]	[,2]	[,3]	[,4]	[,5]
[1,]	3	4	2	5	61
[2,]	5	4	61	62	64
[3,]	1	4	2	5	61
[4,]	2	5	1	61	64
[5,]	2	4	61	62	64
[6,]	29	8	28	31	44
[7,]	60	42	62	63	55
[8,]	28	29	6	10	30
[9,]	12	18	25	24	23
[10,]	28	8	30	26	36
[11,]	14	13	17	23	25
[12,]	18	9	24	25	23
[13,]	14	11	15	17	23
[14,]	13	11	17	23	15
[15,]	16	13	14	11	17
[16,]	15	13	14	11	17
[17,]	23	25	18	12	9
[18,]	12	25	9	24	23
[19,]	27	26	21	36	22
[20,]	24	22	12	18	9
[21,]	19	27	26	22	20
					12
[22,]	20	21	24	19	
[23,]	25	17	18	12	9
[24,]	12	18	20	9	25
[25,]	23	18	12	9	17
[26,]	27	19	21	36	10
[27,]	26	19	21	36	10
[28,]	30	8	32	29	37
[29,]	44	8	28	6	45
[30,]	28	32	37	38	52
[31,]	46	48	41	40	45
[32,]	37	38	33	35	53
[33,]	38	37	32	35	53
[34,]	40	56	50	49	43
[35,]	47	53	33	54	39
[36,]	52	30	37	26	27
[37,]	38	32	33	35	53
		37			
[38,]	33		32	35	53
[39,]	45	51	35	54	44
[40,]	41	34	56	50	31
[41,]	40	31	34	56	50
[42,]	55	57	58	59	43
[43,]	49	59	58	56	50
[44,]	45	47	51	39	54
[45,]	44	51	47	39	54
[46,]	48	31	51	45	39
[47,]	53	54	44	45	35
[48,]	46	51	45	39	31
[49,]	43	50	34	56	59
[50,]	56	49	34	43	40
[51,]	45	54	44	47	48
[1]		٠.		.,	.0

```
32
[52,]
        37
             36
                        38
                             30
        47
                   35
[53,]
             54
                        33
                             38
[54,]
        53
             47
                   51
                        35
                             45
[55,]
        57
             42
                   58
                        59
                             43
[56,]
        50
              34
                   49
                        43
                             40
[57,]
        55
             58
                   59
                        42
                             43
        59
                             49
[58,]
             57
                   55
                        43
[59,]
        58
             57
                   55
                        43
                             49
        42
                   55
                             57
[60,]
             63
                        62
                   63
                        60
                              5
[61,]
        64
             62
                              7
[62,]
        63
             64
                   61
                        60
                              7
[63,]
        62
             64
                   61
                        60
                              5
[64,]
        63
             61
                   62
                        60
$nn.dist
                       [,2]
           [,1]
                                   [,3]
                                              [,4]
                                                          [,5]
 [1,] 388.24779
                 587.93295
                             788.83496
                                         845.95310 1250.53975
 [2,] 72.30712
                 206.78867
                             642.05850
                                         730.45799
                                                    733.71772
 [3,] 388.24779
                 973.70365 1176.33993 1231.98909 1608.76523
 [4,] 206.78867
                 258.66445
                             587.93295
                                         767.00072
                                                    861.94720
 [5,] 72.30712
                 258.66445
                             623.13546
                                         702.59071
                                                    713.23376
 [6,] 286.54072
                  301.07983
                             489.62090
                                         504.11713
                                                     522.34695
 [7,] 556.12859
                 625.69401
                             657.88738
                                         683.72660
                                                     695.86514
 [8,] 256.38800
                 280.45782
                             301.07983
                                         370.15109
                                                     386.60195
 [9,] 140.48057
                 209.96383
                             276.31795
                                         324.52960
                                                     347.09563
[10,] 359.23943
                 370.15109
                             436.10503
                                         550.75279
                                                     569.75132
[11,] 221.66695
                 323.90263
                             576.56208
                                         786.66897
                                                     891.42489
[12,] 95.45022
                 140.48057
                             209.04421
                                         211.91859
                                                     311.63801
                 323.90263
                                         814.95531 1048.09435
[13,] 196.23071
                             725.78479
[14,] 196.23071
                 221.66695
                             621.64174
                                         857.57303
                                                    915.10838
[15,] 585.20556
                 725.78479
                             915.10838 1027.48634 1535.65743
[16,] 585.20556 1309.87329 1496.85570 1611.49610 2115.15853
                 351.39479
                                         548.95324
[17,] 242.91316
                             500.65919
                                                     562.47232
[18,] 95.45022
                 154.03089
                             209.96383
                                         219.36318
                                                    259.89190
[19,] 125.45703
                 141.37774
                             227.34591
                                         601.77706
                                                    635.98131
[20,] 227.96325
                 290.02193
                             412.06109
                                         436.59931
                                                    490.43939
                 332.58301
                             356.57390
                                         410.96476
[21,] 227.34591
                                                     694.78297
[22,] 290.02193
                 410.96476
                             507.22721
                                         635.98131
                                                     696.51288
[23,] 109.50318
                 242.91316
                             259.89190
                                         311.63801
                                                     347.09563
[24,] 209.04421
                 219.36318
                             227.96325
                                         324.52960
                                                     361.90465
[25,] 109.50318
                 154.03089
                             211.91859
                                         276.31795
                                                     351.39479
                 141.37774
                             356.57390
                                         474.89002
[26,] 31.75028
                                                     550.75279
[27,] 31.75028
                 125.45703
                             332.58301
                                         484.34842
                                                     580.34017
[28,] 133.46513
                 256.38800
                             279.88561
                                         286.07371
                                                     328.42120
[29,] 268.60964
                 280.45782
                             286.07371
                                         286.54072
                                                     300.56854
[30,] 133.46513
                 185.70040
                             218.28730
                                         269.05268
                                                     282.30622
[31,] 113.41625
                 154.56971
                             159.78472
                                         206.65794
                                                     211.54736
[32,]
       64.49779
                  94.46088
                             106.86412
                                         169.83531
                                                     177.03982
[33,] 31.58009
                  77.35814
                             106.86412
                                         114.70613
                                                     132.16286
[34,] 112.18349
                 128.81878
                             133.35337
                                         142.39221
                                                    158.43527
[35,] 99.59096
                 101.94486
                             114.70613
                                         120.87621
                                                     127.87942
[36,] 271.60347
                  404.95670
                             460.84799
                                         474.89002
                                                    484.34842
                   64.49779
                              77.35814
                                         177.58289
                                                     181.77272
[37,]
       55.31270
       31.58009
                   55.31270
                              94.46088
                                         136.17892
                                                    141.87164
[38,]
```

innesting in each impartation.						
	[39,] 109.99678	114.73757	127.87942	133.06558	141.26583	
	[40,] 81.97476	112.18349	146.60572	162.17036	206.65794	
	[41,] 81.97476	159.78472	163.52010	225.19102	232.30205	
	[42,] 83.76140	156.94746	189.38706	196.45280	305.68676	
	[43,] 105.23464	142.20372	144.55470	146.02830	152.39403	
	[44,] 40.83127	93.81094	102.29802	141.26583	142.50965	
	[45,] 40.83127	69.29416	95.38806	109.99678	125.15865	
	[46,] 55.41662	113.41625	128.01042	135.84310	160.25099	
	[47,] 56.34155	68.55511	93.81094	95.38806	99.59096	
	[48,] 55.41662	112.25026	144.52696	145.75431	154.56971	
	[49,] 105.23464	114.53172	142.39221	144.64959	147.74157	
	[50,] 54.10700	114.53172	133.35337	152.39403	162.17036	
	[51,] 69.29416	95.81040	102.29802	105.04044	112.25026	
	[52,] 246.43644	271.60347	279.78901	281.49894	282.30622	
	[53,] 56.34155	66.10978	101.94486	132.16286	141.87164	
	[54,] 66.10978	68.55511	95.81040	120.87621	125.15865	
	[55,] 78.41290	83.76140	126.52069	136.27121	259.93572	
	[56,] 54.10700	128.81878	144.64959	146.02830	146.60572	
	[57,] 78.41290	114.30608	127.77576	156.94746	240.68847	
	[58,] 19.94802	114.30608	126.52069	144.55470	159.22756	
	[59,] 19.94802	127.77576	136.27121	142.20372	147.74157	
	[60,] 373.70198	388.78342	399.82054	406.16119	426.91770	
	[61,] 96.93285	148.19590	169.33067	553.50708	623.13546	
	[62,] 47.64674	103.56268	148.19590	406.16119	657.88738	
	[63,] 47.64674	96.64094	169.33067	388.78342	683.72660	
	[64,] 96.64094	96.93285	103.56268	482.78665	713.23376	