BTC-Technical-Indicators-Walkthrough

September 29, 2021

1 Technical Indicators

Adding technical indicator values

1.0.1 Importing Libraries and Data

```
[8]: import pandas as pd
     import _pickle as pickle
     import numpy as np
     import matplotlib.pyplot as plt
     plt.style.use('bmh')
[9]: df = pd.read_csv('BTC-USD.csv')
     # Viewing the DF
     df
[9]:
                  Date
                                 Open
                                                High
                                                                             Close
     0
           2014-09-17
                          465.864014
                                          468.174011
                                                         452.421997
                                                                        457.334015
     1
           2014-09-18
                          456.859985
                                          456.859985
                                                         413.104004
                                                                        424.440002
     2
           2014-09-19
                          424.102997
                                          427.834991
                                                         384.532013
                                                                        394.795990
     3
           2014-09-20
                          394.673004
                                         423.295990
                                                         389.882996
                                                                        408.903992
     4
           2014-09-21
                          408.084991
                                         412.425995
                                                         393.181000
                                                                        398.821014
     5
           2014-09-22
                          399.100006
                                         406.915985
                                                         397.130005
                                                                        402.152008
     6
           2014-09-23
                          402.092010
                                          441.557007
                                                         396.196991
                                                                        435.790985
     7
           2014-09-24
                          435.751007
                                          436.112000
                                                         421.131989
                                                                        423.204987
     8
           2014-09-25
                          423.156006
                                         423.519989
                                                         409.467987
                                                                        411.574005
     9
           2014-09-26
                          411.428986
                                          414.937988
                                                         400.009003
                                                                        404.424988
     10
           2014-09-27
                          403.556000
                                          406.622986
                                                         397.372009
                                                                        399.519989
     11
                                                         374.332001
                                                                        377.181000
           2014-09-28
                          399.471008
                                          401.016998
     12
           2014-09-29
                          376.928009
                                         385.210999
                                                         372.239990
                                                                        375.467010
     13
           2014-09-30
                          376.088013
                                          390.976990
                                                         373.442993
                                                                        386.944000
     14
           2014-10-01
                          387.427002
                                          391.378998
                                                         380.779999
                                                                        383.614990
     15
           2014-10-02
                          383.988007
                                          385.497009
                                                         372.946014
                                                                        375.071991
     16
           2014-10-03
                          375.181000
                                          377.695007
                                                         357.859009
                                                                        359.511993
     17
           2014-10-04
                          359.891998
                                          364.487000
                                                         325.885986
                                                                        328.865997
     18
           2014-10-05
                          328.915985
                                          341.800995
                                                         289.295990
                                                                        320.510010
     19
           2014-10-06
                          320.389008
                                         345.134003
                                                         302.559998
                                                                        330.079010
```

20	2014-10-07	330.584015	339.247009	320.481995	336.187012
21	2014-10-08	336.115997	354.364014	327.187988	352.940002
22	2014-10-09	352.747986	382.726013	347.687012	365.026001
23	2014-10-10	364.687012	375.066986	352.963013	361.562012
24	2014-10-11	361.362000	367.191010	355.950989	362.299011
25	2014-10-12	362.605988	379.433014	356.144012	378.549011
26	2014-10-13	377.920990	397.226013	368.897003	390.414001
27	2014-10-14	391.691986	411.697998	391.324005	400.869995
28	2014-10-15	400.954987	402.226990	388.765991	394.773010
29	2014-10-16	394.518005	398.807007	373.070007	382.556000
•••	•••	•••	•••	•••	•••
1975	2020-02-13	10323.960938	10457.626953	10116.161133	10214.379883
1976	2020-02-14	10211.550781	10321.996094	10125.534180	10312.116211
1977	2020-02-15	10313.856445	10341.555664	9874.427734	9889.424805
1978	2020-02-16	9889.179688	10053.968750	9722.386719	9934.433594
1979	2020-02-17	9936.560547	9938.815430	9507.637695	9690.142578
1980	2020-02-18	9691.230469	10161.935547	9632.382813	10141.996094
1981	2020-02-19	10143.798828	10191.675781	9611.223633	9633.386719
1982	2020-02-20	9629.325195	9643.216797	9507.900391	9608.475586
1983	2020-02-21	9611.782227	9723.014648	9589.743164	9686.441406
1984	2020-02-22	9687.707031	9698.231445	9600.728516	9663.181641
1985	2020-02-23	9663.318359	9937.404297	9657.791016	9924.515625
1986	2020-02-24	9921.583008	9951.746094	9537.042969	9650.174805
1987	2020-02-25	9651.312500	9652.737305	9305.021484	9341.705078
1988	2020-02-26	9338.290039	9354.778320	8704.426758	8820.522461
1989	2020-02-27	8825.093750	8932.892578	8577.199219	8784.494141
1990	2020-02-28	8788.728516	8890.456055	8492.932617	8672.455078
1991	2020-02-29	8671.212891	8775.631836	8599.508789	8599.508789
1992	2020-03-01	8599.758789	8726.796875	8471.212891	8562.454102
1993	2020-03-02	8563.264648	8921.308594	8532.630859	8869.669922
1994	2020-03-03	8865.387695	8901.598633	8704.990234	8787.786133
1995	2020-03-04	8788.541992	8843.366211	8712.431641	8755.246094
1996	2020-03-05	8760.285156	9142.054688	8757.253906	9078.762695
1997	2020-03-06	9078.308594	9167.695313	9032.079102	9122.545898
1998	2020-03-07	9121.600586	9163.220703	8890.744141	8909.954102
1999	2020-03-08	8908.206055	8914.343750	8105.252930	8108.116211
2000	2020-03-09	8111.146484	8177.793457	7690.098145	7923.644531
2001	2020-03-10	7922.146973	8136.945313	7814.763184	7909.729492
2002	2020-03-11	7910.089844	7950.814453	7642.812500	7911.430176
2003	2020-03-12	7913.616211	7929.116211	4860.354004	4970.788086
2004	2020-03-13	5032.356934	5837.304688	4121.311035	5095.102539
	A 4 - 47 -				
0	Adj Close 457.334015				
0					
1 2	424.440002				
3	394.795990				
3	408.903992	2 30003000			

1	200 001014	26590100
4 5	398.821014 402.152008	26580100 24127600
6	435.790985	45099500
7	423.204987	
	423.204987	30627700
8		26814400
9	404.424988	21460800
10	399.519989	15029300
11	377.181000	23613300
12	375.467010	32497700
13	386.944000	34707300
14	383.614990	26229400
15	375.071991	21777700
16	359.511993	30901200
17	328.865997	47236500
18	320.510010	83308096
19	330.079010	79011800
20	336.187012	49199900
21	352.940002	54736300
22	365.026001	83641104
23	361.562012	43665700
24	362.299011	13345200
25	378.549011	17552800
26	390.414001	35221400
27	400.869995	38491500
28	394.773010	25267100
29	382.556000	26990000
1975	10214.379883	49356071372
1976	10312.116211	43338264161
1977	9889.424805	43865054831
1978	9934.433594	43374780305
1979	9690.142578	45998298412
1980	10141.996094	47271023953
1981	9633.386719	46992019709
1982	9608.475586	44925260236
1983	9686.441406	40930547512
1984	9663.181641	35838025154
1985	9924.515625	41185185761
1986	9650.174805	45080496648
1987	9341.705078	42515259129
1988	8820.522461	50420050761
1989	8784.494141	45470195695
1990	8672.455078	44605450442
1991	8599.508789	35792392544
1992	8562.454102	35349164300
1993	8869.669922	42857674408
1994	8787.786133	42386715820
1001	3,3,,,,,,,,,	12000110020

```
1995
      8755.246094 34746706368
1996
      9078.762695 39698054597
1997
      9122.545898 40826885650
1998
      8909.954102 36216930369
1999
      8108.116211 39973102120
2000
      7923.644531 46936995808
2001
      7909.729492 42213940993
2002
      7911.430176 38682762604
2003
      4970.788086 53980357243
2004
      5095.102539 70775234560
```

[2005 rows x 7 columns]

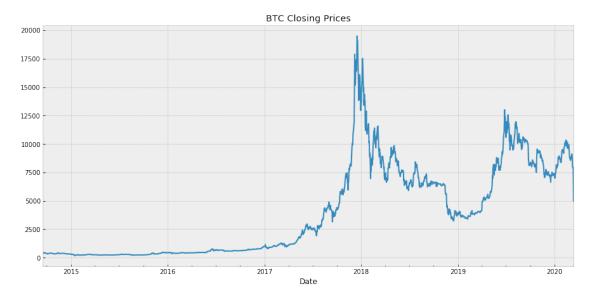
1.0.2 Datetime Conversion

```
[10]: # Datetime conversion
df['Date'] = pd.to_datetime(df.Date)

# Setting the index
df.set_index('Date', inplace=True)
```

1.1 Charting Values

```
[11]: # Viewing the Chart of Closing Values
df['Close'].plot(figsize=(15,7), title='BTC Closing Prices');
```



1.2 Creating the Technical Indicators

```
def SMA(df, periods=50):
    """
    Calculating the Simple Moving Average for the past n days

**Values must be descending**
    """
lst = []

for i in range(len(df)):
    if i < periods:
        # Appending NaNs for instances unable to look back on
        lst.append(np.nan)

else:
        # Calculating the SMA
        lst.append(round(np.mean(df[i:periods+i]), 2))

return lst</pre>
```

```
[13]: def Stoch(closes, lows, highs, periods=14, d_periods=3):
          Calculating the Stochastic Oscillator for the past n days
          **Values must be descending**
          11 11 11
          k_lst = []
          d_1st = []
          for i in range(len(closes)):
              if i < periods:</pre>
                   # Appending NaNs for instances unable to look back on
                  k_lst.append(np.nan)
                  d_lst.append(np.nan)
              else:
                   # Calculating the Stochastic Oscillator
                   # Calculating the %K line
                  highest = max(highs[i:periods+i])
                  lowest = min(lows[i:periods+i])
```

```
k = ((closes[i] - lowest) / (highest - lowest)) * 100

k_lst.append(round(k, 2))

# Calculating the %D line
if len(k_lst) < d_periods:
    d_lst.append(np.nan)
else:
    d_lst.append(round(np.mean(k_lst[-d_periods-1:-1])))

return k_lst, d_lst</pre>
```

```
[14]: def RSI(df, periods=14):
          Calculates the Relative Strength Index
          **Values must be descending**
          11 11 11
          df = df.diff()
          lst = []
          for i in range(len(df)):
              if i < periods:</pre>
                   # Appending NaNs for instances unable to look back on
                   lst.append(np.nan)
              else:
                   # Calculating the Relative Strength Index
                   avg_gain = (sum([x for x in df[i:periods+i] if x >= 0]) / periods)
                   avg_loss = (sum([abs(x) for x in df[i:periods+i] if x <= 0], .
       \rightarrow00001) / periods)
                  rs = avg_gain / avg_loss
                  rsi = 100 - (100 / (1 + rs))
                   lst.append(round(rsi, 2))
          return 1st
```

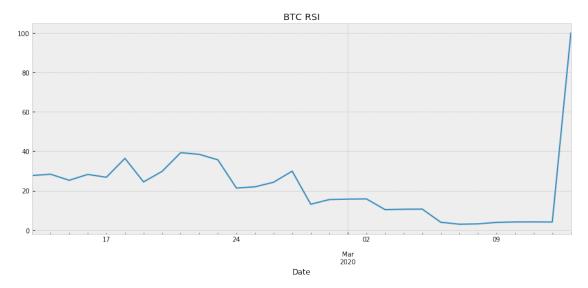
1.3 Creating New Values and Plotting

Based on the Indicators

RSI Indicator

```
[15]: df['RSI'] = RSI(df.Close)

# Plotting
df['RSI'][-30:].plot(figsize=(15,6), title='BTC RSI');
```



Stochastic Oscillator

```
[16]: df['Stoch_k'], df['Stoch_d'] = Stoch(df.Close, df.Low, df.High)

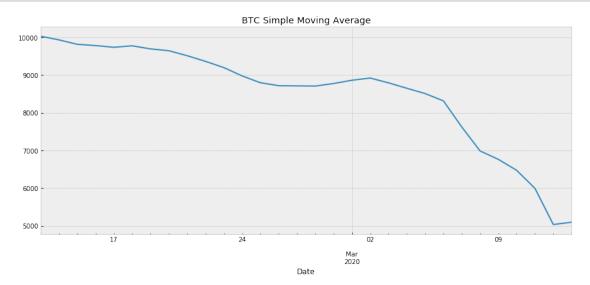
# Plotting
df[-30:].plot(y=['Stoch_k', 'Stoch_d'], figsize=(15,6), title='BTC Stochastic
→Oscillator');
```



Simple Moving Average

```
[17]: df['SMA'] = SMA(df.Close, 6)

# Plotting
df['SMA'][-30:].plot(figsize=(15,6), title='BTC Simple Moving Average');
```





```
2020-03-04
           8788.541992
                        8843.366211
                                     8712.431641 8755.246094
                                                               8755.246094
           8760.285156
                                     8757.253906 9078.762695
                                                               9078.762695
2020-03-05
                        9142.054688
2020-03-06
           9078.308594
                        9167.695313
                                     9032.079102
                                                  9122.545898
                                                               9122.545898
2020-03-07
           9121.600586
                        9163.220703
                                     8890.744141
                                                  8909.954102
                                                               8909.954102
2020-03-08
           8908.206055 8914.343750
                                     8105.252930 8108.116211
                                                               8108.116211
2020-03-09
           8111.146484
                        8177.793457
                                     7690.098145
                                                  7923.644531
                                                               7923.644531
2020-03-10 7922.146973 8136.945313
                                     7814.763184
                                                  7909.729492
                                                               7909.729492
2020-03-11 7910.089844 7950.814453
                                     7642.812500
                                                  7911.430176
                                                               7911.430176
2020-03-12 7913.616211
                        7929.116211
                                     4860.354004 4970.788086
                                                               4970.788086
2020-03-13 5032.356934
                        5837.304688
                                                               5095.102539
                                     4121.311035
                                                  5095.102539
                Volume
                           RSI Stoch_k Stoch_d
                                                      SMA
Date
2020-03-04
           34746706368
                         10.54
                                  91.83
                                            92.0 8649.71
2020-03-05
                         10.62
                                  98.24
                                            93.0 8508.79
           39698054597
                                            94.0 8314.24
2020-03-06
           40826885650
                          3.93
                                  99.11
                          2.94
                                  94.98
                                            96.0 7622.28
2020-03-07
            36216930369
                          3.10
                                            97.0 6986.47
2020-03-08
           39973102120
                                  83.18
2020-03-09
           46936995808
                          3.86
                                  93.73
                                            92.0 6762.14
2020-03-10 42213940993
                          4.09
                                  94.34
                                            91.0 6471.76
2020-03-11
           38682762604
                          4.11
                                  98.97
                                            90.0 5992.44
                          4.06
                                  22.31
                                            96.0 5032.95
2020-03-12 53980357243
2020-03-13 70775234560
                        100.00
                                  56.75
                                            72.0 5095.10
```

1.4 Using a Technical Analysis Python Library

```
[19]: # Importing Library
import ta

[20]: # TA's RSI
    df['ta_rsi'] = ta.momentum.rsi(df.Close)

# TA's Stochastic Oscillator
    df['ta_stoch_k'] = ta.momentum.stoch(df.High, df.Low, df.Close)
    df['ta_stoch_d'] = ta.momentum.stoch_signal(df.High, df.Low, df.Close)

[21]: # Showing our own custom indicators plus the libraries
    df.drop(df.columns[:6], axis=1).tail(10)

[21]: RSI Stoch_k Stoch_d SMA ta_rsi ta_stoch_k \
Date
    Date
    Date
    Date
    Date
```

```
2020-03-10
              4.09
                      94.34
                                 91.0 6471.76
                                                30.764346
                                                             13.193606
              4.11
                      98.97
2020-03-11
                                 90.0
                                       5992.44
                                                30.808518
                                                             17.615627
2020-03-12
              4.06
                      22.31
                                 96.0
                                       5032.95
                                                14.080537
                                                             2.563857
                      56.75
2020-03-13 100.00
                                 72.0
                                       5095.10
                                                16.153175
                                                             19.296816
            ta_stoch_d
Date
2020-03-04
             20.248288
2020-03-05
             26.206956
2020-03-06
             34.737846
2020-03-07
             38.221005
2020-03-08
             24.594068
2020-03-09
             13.896225
2020-03-10
             8.416094
2020-03-11
             14.236281
2020-03-12
             11.124364
2020-03-13
             13.158767
```

1.4.1 Using only the TA library's Indicators

Dropping our own custom indicators

```
[25]: df.drop(df.columns[6:], axis=1, inplace=True)

[40]: # Adding all the indicators
    df = ta.add_all_ta_features(df, open="Open", high="High", low="Low",
        →close="Close", volume="Volume", fillna=True)
[42]: # Dropping everything else besides 'Close' and the Indicators
```

```
[42]: # Dropping everything else besides 'Close' and the Indicators
df.drop(['Open', 'High', 'Low', 'Adj Close', 'Volume'], axis= 1, inplace=True)
df
```

```
[42]:
                         Close
                                  volume_adi
                                                 volume_obv
                                                             volume_cmf
      Date
                    457.334015 -7.924336e+06
                                                              -0.376331
      2014-09-17
                                                   21056800
      2014-09-18
                    424.440002 -2.454020e+07
                                                              -0.441847
                                                  -13426400
      2014-09-19
                    394.795990 -4.448391e+07
                                                  -51346100
                                                              -0.475969
                    408.903992 -3.937687e+07
                                                              -0.302148
      2014-09-20
                                                  -14482500
      2014-09-21
                    398.821014 -5.037763e+07
                                                  -41062600
                                                              -0.321074
      2014-09-22
                    402.152008 -4.974146e+07
                                                  -16935000
                                                              -0.274768
      2014-09-23
                    435.790985 -1.610777e+07
                                                   28164500
                                                              -0.071232
      2014-09-24
                    423.204987 -3.825869e+07
                                                   -2463200
                                                              -0.149007
      2014-09-25
                    411.574005 -5.703557e+07
                                                  -29277600
                                                              -0.201132
      2014-09-26
                    404.424988 -6.580018e+07
                                                              -0.215715
                                                  -50738400
      2014-09-27
                    399.519989 -7.385019e+07
                                                  -65767700
                                                              -0.230737
                    377.181000 -9.242139e+07
      2014-09-28
                                                  -89381000
                                                              -0.268920
      2014-09-29
                    375.467010 -1.087491e+08
                                                              -0.289093
                                                 -121878700
```

```
2014-09-30
              386.944000 -9.000780e+07
                                                        -0.219061
                                            -87171400
              383.614990 -1.022057e+08
                                                        -0.233821
2014-10-01
                                           -113400800
2014-10-02
              375.071991 -1.166056e+08
                                           -135178500
                                                        -0.254105
2014-10-03
              359.511993 -1.423567e+08
                                           -166079700
                                                        -0.290649
              328.865997 -1.822998e+08
2014-10-04
                                           -213316200
                                                        -0.339462
2014-10-05
              320.510010 -1.665553e+08
                                                        -0.268493
                                           -296624296
              330.079010 -1.434237e+08
2014-10-06
                                           -217612496
                                                        -0.205083
2014-10-07
              336.187012 -1.102698e+08
                                           -168412596
                                                        -0.140683
              352.940002 -6.126977e+07
2014-10-08
                                           -113676296
                                                        -0.049121
              365.026001 -6.213157e+07
2014-10-09
                                            -30035192
                                                        -0.022241
              361.562012 -7.182317e+07
2014-10-10
                                            -73700892
                                                        -0.040544
              362.299011 -7.009444e+07
                                            -60355692
                                                        -0.025052
2014-10-11
2014-10-12
              378.549011 -5.387418e+07
                                            -42802892
                                                        -0.005295
2014-10-13
              390.414001 -3.559150e+07
                                             -7581492
                                                        -0.025285
              400.869995 -3.801354e+07
                                                          0.000315
2014-10-14
                                             30910008
2014-10-15
              394.773010 -4.072957e+07
                                              5642908
                                                          0.020989
              382.556000 -4.782394e+07
2014-10-16
                                            -21347092
                                                          0.022975
2020-02-13
            10214.379883
                          8.775369e+11
                                         625896693165
                                                          0.255428
2020-02-14
            10312.116211
                          9.165162e+11
                                         669234957326
                                                          0.306716
2020-02-15
             9889.424805
                          8.754678e+11
                                         625369902495
                                                          0.209350
2020-02-16
             9934.433594
                          8.875694e+11
                                         668744682800
                                                          0.196351
2020-02-17
             9690.142578
                          8.805105e+11
                                         622746384388
                                                          0.136835
2020-02-18
            10141.996094 9.242217e+11
                                         670017408341
                                                          0.204697
2020-02-19
             9633.386719
                          8.808182e+11
                                         623025388632
                                                          0.113443
2020-02-20
             9608.475586
                          9.026752e+11
                                         578100128396
                                                          0.145818
2020-02-21
             9686.441406
                          9.211409e+11
                                         619030675908
                                                          0.157686
2020-02-22
             9663.181641
                          9.312132e+11
                                         583192650754
                                                          0.168945
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