Basic Operations

This lecture will cover some basic operations with Spark DataFrames.

We will play around with some stock data from Apple.

```
In [1]: from pyspark.sql import SparkSession
 In [2]: # May take awhile locally
         spark = SparkSession.builder.appName("Operations").getOrCreate()
In [26]: # Let Spark know about the header and infer the Schema types!
         df = spark.read.csv('appl_stock.csv',inferSchema=True,header=True)
In [28]: df.printSchema()
         root
           |-- Date: timestamp (nullable = true)
           |-- Open: double (nullable = true)
           |-- High: double (nullable = true)
           |-- Low: double (nullable = true)
           |-- Close: double (nullable = true)
           |-- Volume: integer (nullable = true)
           |-- Adj Close: double (nullable = true)
```

Filtering Data

A large part of working with DataFrames is the ability to quickly filter out data based on conditions. Spark DataFrames are built on top of the Spark SQL platform, which means that is you already know SQL, you can quickly and easily grab that data using SQL commands, or using the DataFram methods (which is what we focus on in this course).

| <pre># Using SQL df.filter("Close<500"</pre> |).show() | | | |
|---|------------------------|------------------|-----------------------|-------------------------|
| + | + | + | + | |
| Date e Adj Close | | | | Close Volu |
| -++ | | + | | |
| 2010-01-04 00:00: | | 214.499996 | 212.38000099999996 | 214.009998 1234324 |
| 0 27.727039 2010-01-05 00:00: | | 215.589994 | 213.249994 | 214.379993 150476 |
| 0 27.7749760000000002 | | 213.369994 | 213.249994 | 214.3733331130470 |
| 2010-01-06 00:00: 0 27.333178000000004 | 214.379993 | 215.23 | 210.750004 | 210.969995 138040 |
| 2010-01-07 00:00: 0 27.28265 | | 212.000006 | 209.050005 | 210.58 119282 |
| 2010-01-08 00:00: | | 212.000006 | 209.06000500000002 21 | 1.98000499999998 111902 |
| · . | 212.79999700000002 | 213.000002 | 208.450005 21 | 0.1100029999998 115557 |
| • . | 209.1899949999998 209 | .769995000000002 | 206.419998 | 207.720001 148614 |
| • | 207.870005 210 | .92999500000002 | 204.099998 | 210.650002 151473 |
| ' . | 210.11000299999998 210 | .45999700000002 | 209.020004 | 209.43 108223 |
| | 210.92999500000002 211 | .59999700000003 | 205.869999 | 205.93 148516 |
| 0 26.680197999999997 2010-01-19 00:00: | 208.330002 215 | .18999900000003 | 207.240004 | 215.039995 182501 |
| 0 27.860484999999997 2010-01-20 00:00: | 214.910006 | 215.549994 | 209.500002 | 211.73 153038 |
| 0 27.431644 2010-01-21 00:00: | | .3099959999998 | 207.210003 | 208.069996 152038 |
| 0 26.957455 2010-01-22 00:00: | 206.78000600000001 | 207.499996 | 197.16 | 197.75 220441 |
| 0 25.620401 | 202.51000200000001 | 204.699999 | | • |
| 0 26.309658000000002 2010-01-26 00:00: | | | · | · |
| 2010-01-26 00:00: 0 | 100.3500010000000001 | 213.710005 | 202.580004 | 205.940001 466777 |

```
|2010-01-27 00:00:...|
                        206.849995
                                           210.58
                                                       199.530001
                                                                       207.880005 | 43064210
0|26.932840000000002|
|2010-01-28 00:00:...|
                        204.930004
                                        205.500004
                                                       198.699995
                                                                       199.289995 | 29337560
0 | 25.8199220000000002 |
                                        202.199995
                                                                       192.060003 | 31148810
|2010-01-29 00:00:...|
                        201.079996
                                                       190.250002
0 l
        24.883208
                                            196.0 | 191.29999899999999 |
                                                                       194.729998 | 18746910
|2010-02-01 00:00:...|192.3699969999998|
    25.229131
                    -+----+
only showing top 20 rows
```

```
In [35]: # Using SOL with .select()
          df.filter("Close<500").select('Open').show()</pre>
```

```
+----+
             0pen|
        213.429998
        214.599998
        214.379993
            211.75
        210.299994
212.79999700000002
209.18999499999998
        207.870005
210.11000299999998
|210.92999500000002|
        208.330002
        214.910006
        212.079994
|206.78000600000001|
202.51000200000001
|205.95000100000001|
        206.849995
        204.930004
        201.079996
|192.3699969999998|
only showing top 20 rows
```

In [36]: # Using SQL with .select() df.filter("Close<500").select(['Open','Close']).show()</pre>

| + | ++ |
|--------------------|--------------------|
| l Open | Close |
| | ++ |
| 213.429998 | 214.009998 |
| 214.599998 | 214.379993 |
| 214.379993 | : : |
| ! | ! |
| 211.75 | : : |
| 210.299994 | 211.98000499999998 |
| 212.79999700000002 | 210.11000299999998 |
| 209.18999499999998 | 207.720001 |
| 207.870005 | 210.650002 |
| 210.11000299999998 | 209.43 |
| 210.92999500000002 | 205.93 |
| 208.330002 | 215.039995 |
| 214.910006 | 211.73 |
| 212.079994 | 208.069996 |
| 206.78000600000001 | 197.75 |
| 202.51000200000001 | 203.070002 |
| 205.95000100000001 | 205.940001 |
| 206.849995 | 207.880005 |
| 204.930004 | 199.289995 |
| 201.079996 | 192.060003 |
| 192.3699969999998 | 194.729998 |
| + | ++ |
| | |

only showing top 20 rows

Using normal python comparison operators is another way to do this, they will look very similar to SQL operators, except you need to make sure you are calling the entire column within the dataframe, using the format: df["column name"]

Let's see some examples:

```
In [38]. | df filton/df["(loco"] / 288) chow/)
```

```
III [30]. | u1.111ce (u1 C105e ] \ 200).3110W()
                               Date
                                      0pen|
                                                       High
                                                                        Low
                Adj Close
        e|
        -+----+
        |2010-01-22 00:00:...|206.78000600000001|
                                                  207.499996
                                                                      197.16
                                                                                       197.75 | 22044190
        0 25.620401
        |2010-01-28 00:00:...|
                                  204.930004
                                                  205.500004
                                                                  198.699995
                                                                                   199.289995 | 29337560
        0|25.819922000000002|
        |2010-01-29 00:00:...|
                                  201.079996
                                                  202.199995
                                                                  190.250002
                                                                                   192.060003|31148810
                24.883208
        0 l
        |2010-02-01 00:00:...|192.3699969999998|
                                                      196.0 | 191.2999989999999 |
                                                                                   194.729998 | 18746910
        0 25.229131
        |2010-02-02 00:00:...|
                                  195.909998
                                                  196.319994 | 193.3799929999998 |
                                                                                   195.859997 | 17458560
        0|25.375532999999997|
        |2010-02-03 00:00:...|
                                 195.169994
                                                  200.200003|
                                                                   194.420004
                                                                                   199.229994 | 15383200
        0|25.812148999999998|
        |2010-02-04 00:00:...|
                                  196.730003
                                                  198.370001
                                                                   191.570005
                                                                                   192.050003 | 18941300
        0 24.881912
        |2010-02-05 00:00:...|192.63000300000002|
                                                                                   195.460001 | 21257670
                                                      196.0
                                                                   190.850002
        0|25.3237100000000002|
        |2010-02-08 00:00:...|
                                  195.690006 | 197.88000300000002 |
                                                                   193.999994 | 194.1199969999998 | 11956770
        0 l
             25.1501
        |2010-02-09 00:00:...|
                                  196.419996
                                                  197.499994
                                                                  194.749998 | 196.19000400000002 | 15822170
        0 25.418289
                                  195.889997
                                                                      194.26 | 195.12000700000002 | 9259040
        |2010-02-10 00:00:...|
                                                      196.6
        0|
                25.27966
        |2010-02-11 00:00:...|
                                  194.880001
                                                  199.750006 | 194.0599959999998 |
                                                                                   198.669994 | 13758640
        0| 25.739595|
        |2010-02-23 00:00:...|
                                  199.999998
                                                  201.330002
                                                                   195.709993
                                                                                   197.059998 | 14377370
        0 25.531005
        |2014-06-09 00:00:...|
                                   92.699997
                                                   93.879997
                                                                      91.75
                                                                                    93.699997 | 7541500
        0 88.906324
        |2014-06-10 00:00:...|
                                   94.730003
                                                   95.050003|
                                                                       93.57
                                                                                       94.25 | 6277700
        0 89.428189
        |2014-06-11 00:00:...|
                                   94.129997
                                                   94.760002
                                                                    93.470001
                                                                                    93.860001 | 4568100
        0 89.058142
        |2014-06-12 00:00:...|
                                   94.040001
                                                   94.120003
                                                                   91.900002
                                                                                    92.290001 5474900
        0 87.568463
        |2014-06-13 00:00:...|
                                   92.199997
                                                   92.440002
                                                                    90.879997
                                                                                    91.279999 5452500
        0 86.610132
        |2014-06-16 00:00:...|
                                   91.510002
                                                      92.75
                                                                    91.449997
                                                                                    92.199997 | 3556100
        0 87.483064
        |2014-06-17 00:00:...|
                                   92.309998
                                                   92.699997
                                                                   91.800003 | 92.08000200000001 | 2972600
        0 | 87.369206999999999
        -+----+
        only showing top 20 rows
In [39]: # Will produce an error, make sure to read the error!
        df.filter(df["Close"] < 200 and df['Open'] > 200).show()
                                           Traceback (most recent call last)
        <ipython-input-39-df4ea1e41a0f> in <module>()
        ----> 1 df.filter(df["Close"] < 200 and df['Open'] > 200).show()
        /usr/local/Cellar/apache-spark/2.0.1/libexec/python/pyspark/sql/column.py in __nonzero__(self)
           425
           426
                      nonzero (self):
                      raise ValueError("Cannot convert column into bool: please use '&' for 'and', '|' for 'or',
        --> 427
                                    "'~' for 'not' when building DataFrame boolean expressions.")
           428
                   bool = nonzero
        ValueError: Cannot convert column into bool: please use '&' for 'and', '|' for 'or', '~' for 'not' when bu
        ilding DataFrame boolean expressions.
In [47]: # Make sure to add in the parenthesis separating the statements!
        df.filter( (df["Close"] < 200) & (df['Open'] > 200) ).show()
                                     Open | High | Low | Close | Volume | Adj Close |
        |2010-01-22 00:00:...|206.78000600000001|207.499996| 197.16| 197.75|220441900|
        24 8832081
```

| In [49]: | # Make sure to add in the parenthesis separating the statements! |
|----------|---|
| | <pre>#f.filter((df["Close"] < 200) (df['Open'] > 200)).show()</pre> |

| + | ++ | + | | · |
|-------------------------------------|-----------------------|---------------------|---------------------|-----------------------------|
| -++ | | | | |
| Date | Open | High | Low | Close Volum |
| e Adj Close | | | | |
| + | ++ | + | | ·+ |
| -++ | | | | |
| 2010-01-04 00:00: | 213.429998 | 214.499996 | 212.380000999999996 | 214.009998 12343240 |
| 0 27.727039 | | | | |
| 2010-01-05 00:00: | 214.599998 | 215.589994 | 213.249994 | 214.379993 15047620 |
| 0 27.774976000000002 | | | | |
| 2010-01-06 00:00: | 214.379993 | 215.23 | 210.750004 | 210.969995 13804000 |
| 0 27.333178000000004 | | | | |
| 2010-01-07 00:00: | 211.75 | 212.000006 | 209.050005 | 210.58 11928280 |
| 0 27.28265 | | | | |
| 2010-01-08 00:00: | 210.299994 | 212.000006 | 209.060005000000002 | 211.98000499999998 11190270 |
| 0 27.464034 | | | | |
| 2010-01-11 00:00: | 212.79999700000002 | 213.000002 | 208.450005 | 210.1100029999998 11555740 |
| 0 27.221758 | | | | |
| 2010-01-12 00:00: | 209.18999499999998 | 209.76999500000002 | 206.419998 | 207.720001 14861490 |
| 0 26.91211 | | | | |
| 2010-01-13 00:00: | 207.870005 | 210.929995000000002 | 204.099998 | 210.650002 15147300 |
| 0 27.29172 | | | | |
| 2010-01-14 00:00: | 210.110002999999998 | 210.45999700000002 | 209.020004 | 209.43 10822350 |
| 0 27.133657 | | | | |
| 2010-01-15 00:00: | 210.929995000000002 | 211.599997000000003 | 205.869999 | 205.93 14851690 |
| 0 26.680197999999997 | | | | |
| 2010-01-19 00:00: | 208.330002 | 215.18999900000003 | 207.240004 | 215.039995 18250190 |
| 0 27.860484999999997 | 1 214 0100001 | 245 540004 | 200 500002 | 211 72 115202020 |
| 2010-01-20 00:00: | 214.910006 | 215.549994 | 209.500002 | 211.73 15303820 |
| 0 27.431644 | 1 212 0700041 | 242 2000050000000 | 207 210002 | 200 000000115202000 |
| 2010-01-21 00:00: 0 26.957455 | 212.0/9994 | 213.30999599999998 | 207.210003 | 208.069996 15203860 |
| 0 26.957455 2010-01-22 00:00: | 1206 700006000000011 | 207.499996 | 197.16 | 197.75 22044190 |
| 0 25.620401 | [200.780000000000001] | 207.499990 | 197.10 | 197.73 22044190 |
| 23.626461 | 202 510002000000001 | 204.699999 | 200.190002 | 203.070002 26642490 |
| 0 26.3096580000000002 | [202.31000200000001] | 204.000000 | 200.170002 | 203:070002 20042430 |
| 2010-01-26 00:00: | 1205 9500010000000011 | 213.710005 | 202.580004 | 205.940001 46677750 |
| 0 26.681494 | [203.33000100000001 | 213.710005 | 202.300004 | 203.340001740077730 |
| 2010-01-27 00:00: | 206.849995 | 210.58 | 199.530001 | 207.880005 43064210 |
| 0 26.9328400000000002 | | 220.50 | 255.550002 | 20, 1000005 1300 1220 |
| 2010-01-28 00:00: | 204.930004 | 205.500004 | 198.699995 | 199.289995 29337560 |
| 0 25.8199220000000002 | | | | |
| 2010-01-29 00:00: | 201.079996 | 202.199995 | 190.250002 | 192.060003 31148810 |
| 0 24.883208 | | | | |
| 2010-02-01 00:00: | 192.36999699999998 | 196.0 | 191.29999899999999 | 194.729998 18746910 |
| 0 25.229131 | | | | |
| + | ++ | + | | · |
| -++ | | | | |
| only showing top 20 r | OWS | | | |

In [51]: # Make sure to add in the parenthesis separating the statements! df.filter((df["Close"] < 200) & ~(df['Open'] < 200)).show()</pre>

| Date | + Open | + High | Low | Close | Volume | Adj Close |
|---|-------------|-------------|------------|------------|--------|---------------------|
| 2010-01-22 00:00: 2010-01-28 00:00: 2010-01-29 00:00: | 204.930004 | | 198.699995 | 199.289995 | | 25.8199220000000002 |

In [46]: df.filter(df["Low"] == 197.16).show()

| Date | Open | High | Low | Close | Volume Adj | Close |
|-------------------|--------------------|------------|--------|--------|---------------|--------|
| 2010-01-22 00:00: | 206.78000600000001 | 207.499996 | 197.16 | 197.75 | 220441900 25. | 620401 |

In [52]: # Collecting results as Python objects
df filtop(df["Low"] == 197 16\ collect()

```
Untitier(untition j == 197.16).collect()

Out[52]: [Row(Date=datetime.datetime(2010, 1, 22, 0, 0), Open=206.7800060000001, High=207.499996, Low=197.16, Close=197.75, Volume=220441900, Adj Close=25.620401)]

In [53]: result = df.filter(df["Low"] == 197.16).collect()

In [62]: # Note the nested structure returns a nested row object type(result[0])

Out[62]: pyspark.sql.types.Row

In [65]: row = result[0]

Rows can be called to turn into dictionaries

In [64]: row.asDict()

Out[64]: {'Adj Close': 25.620401,
```