```
Python 2.7.10 | Anaconda 2.3.0 (64-bit) | (default, May 28 2015, 16:44:52) [MSC v.1500
64 bit (AMD64)]
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IPython 3.2.0 -- An enhanced Interactive Python.
Anaconda is brought to you by Continuum Analytics.
Please check out: http://continuum.io/thanks and https://anaconda.org
          -> Introduction and overview of IPython's features.
%quickref -> Quick reference.
          -> Python's own help system.
help
          -> Details about 'object', use 'object??' for extra details.
object?
         -> A brief reference about the graphical user interface.
%guiref
In [1]: V0=17.6639
In [2]: r=0.01
In [3]: import pandas as pd
In [4]: h5=pd.HDFStore('./source/vstoxx_data_31032014.h5')
   ...: futures_data=h5['futures_data']
   ...: options_data=h5['options_data']
   ...: h5.close()
   ...:
In [5]: futures data
Out[5]:
         DATE EXP YEAR EXP MONTH PRICE
                                            MATURITY
                                 4 17.85 2014-04-18 0.049
496 2014-03-31
                    2014
497 2014-03-31
                    2014
                                  5 19.55 2014-05-16 0.126
                                  6 19.95 2014-06-20 0.222
498 2014-03-31
                    2014
499 2014-03-31
                    2014
                                 7 20.40 2014-07-18 0.299
500 2014-03-31
                    2014
                                 8 20.70 2014-08-15 0.375
501 2014-03-31
                    2014
                                 9 20.95 2014-09-19 0.471
502 2014-03-31
                    2014
                                 10 21.05 2014-10-17 0.548
503 2014-03-31
                    2014
                                 11 21.25 2014-11-21 0.644
In [6]: options data.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 395 entries, 46170 to 46564
Data columns (total 8 columns):
            395 non-null datetime64[ns]
DATE
EXP YEAR
            395 non-null int64
EXP MONTH
            395 non-null int64
            395 non-null object
TYPE
            395 non-null float64
STRIKE
            395 non-null float64
PRICE
MATURITY
            395 non-null datetime64[ns]
            395 non-null float64
dtypes: datetime64[ns](2), float64(3), int64(2), object(1)
memory usage: 27.8+ KB
In [7]: options_data[['DATE', 'MATURITY', 'TTM', 'STRIKE', 'PRICE']].head()
Out[7]:
                  MATURITY
                               TTM STRIKE
                                            PRTCF
           DATE
46170 2014-03-31 2014-04-18
                            0.049
                                         1
                                            16.85
46171 2014-03-31 2014-04-18
                                            15.85
                            0.049
                                         2
46172 2014-03-31 2014-04-18
                                            14.85
                            0.049
                                         3
46173 2014-03-31 2014-04-18 0.049
                                         4 13.85
46174 2014-03-31 2014-04-18 0.049
                                            12.85
```

In [8]: options data['IMP VOL']=0.0

```
In [9]: tol=0.5
   ...: for option in options data.index:
            forward=futures_data[futures_data['MATURIY']==options_data.loc[option]
['MATURITY']]['PRICE'].values[0]
            if(forward*(1-tol)<options_data.loc[option]['STRIKE']<forward*(1+tol)):</pre>
   . . . :
                imp_vol=bsm_call_imp_vol(
   ...:
   . . . :
                options data.loc[option]['STRIKE'],
                options_data.loc[option]['TTM'],
   . . . :
                options_data.loc[option]['PRICE'],
   . . . :
                sigma_est=2.,
   . . . :
                it=100)
   . . . :
                options_data['IMP_VOL'].loc[option]=imp_vol
   . . . :
Traceback (most recent call last):
  File "<ipython-input-9-7c193cec3c47>", line 3, in <module>
    forward=futures_data[futures_data['MATURIY']==options_data.loc[option]
['MATURITY']]['PRICE'].values[0]
  File "C:\Anaconda\lib\site-packages\pandas\core\frame.py", line 1797, in __getitem__
    return self._getitem_column(key)
  File "C:\Anaconda\lib\site-packages\pandas\core\frame.py", line 1804, in
_getitem column
    return self._get_item_cache(key)
  File "C:\Anaconda\lib\site-packages\pandas\core\generic.py", line 1084, in
_get_item_cache
    values = self._data.get(item)
  File "C:\Anaconda\lib\site-packages\pandas\core\internals.py", line 2851, in get
    loc = self.items.get loc(item)
  File "C:\Anaconda\lib\site-packages\pandas\core\index.py", line 1572, in get_loc
    return self._engine.get_loc(_values_from_object(key))
  File "pandas\index.pyx", line 134, in pandas.index.IndexEngine.get_loc
(pandas\index.c:3824)
  File "pandas\index.pyx", line 154, in pandas.index.IndexEngine.get_loc
(pandas\index.c:3704)
  File "pandas\hashtable.pyx", line 686, in
pandas.hashtable.PyObjectHashTable.get_item (pandas\hashtable.c:12280)
  File "pandas\hashtable.pyx", line 694, in
pandas.hashtable.PyObjectHashTable.get_item (pandas\hashtable.c:12231)
KeyError: 'MATURIY'
In [10]: tol=0.5
    ...: for option in options_data.index:
             forward=futures data[futures data['MATURIIY']==options data.loc[option]
['MATURITY']]['PRICE'].values[0]
             if(forward*(1-tol)<options data.loc[option]['STRIKE']<forward*(1+tol)):</pre>
    . . . :
                 imp vol=bsm call imp vol(
    . . . :
    . . . :
                 options data.loc[option]['STRIKE'],
    . . . :
```

```
options data.loc[option]['TTM'],
    . . . :
    . . . :
                 r.
                 options data.loc[option]['PRICE'],
    . . . :
                 sigma est=2.,
    . . . :
                 it=100)
    . . . :
                 options data['IMP VOL'].loc[option]=imp vol
    . . . :
    . . . :
Traceback (most recent call last):
  File "<ipython-input-10-65c6e40226e6>", line 3, in <module>
    forward=futures_data[futures_data['MATURIIY']==options_data.loc[option]
['MATURITY']]['PRICE'].values[0]
  File "C:\Anaconda\lib\site-packages\pandas\core\frame.py", line 1797, in __getitem__
    return self._getitem_column(key)
  File "C:\Anaconda\lib\site-packages\pandas\core\frame.py", line 1804, in
_getitem_column
    return self._get_item_cache(key)
  File "C:\Anaconda\lib\site-packages\pandas\core\generic.py", line 1084, in
_get_item_cache
    values = self._data.get(item)
  File "C:\Anaconda\lib\site-packages\pandas\core\internals.py", line 2851, in get
    loc = self.items.get_loc(item)
  File "C:\Anaconda\lib\site-packages\pandas\core\index.py", line 1572, in get loc
    return self._engine.get_loc(_values_from_object(key))
  File "pandas\index.pyx", line 134, in pandas.index.IndexEngine.get loc
(pandas\index.c:3824)
  File "pandas\index.pyx", line 154, in pandas.index.IndexEngine.get loc
(pandas\index.c:3704)
  File "pandas\hashtable.pyx", line 686, in
pandas.hashtable.PyObjectHashTable.get item (pandas\hashtable.c:12280)
  File "pandas\hashtable.pyx", line 694, in
pandas.hashtable.PyObjectHashTable.get_item (pandas\hashtable.c:12231)
KeyError: 'MATURIIY'
In [11]: tol=0.5
    ...: for option in options_data.index:
             forward=futures_data[futures_data['MATURITY']==options_data.loc[option]
['MATURITY']]['PRICE'].values[0]
             if(forward*(1-tol)<options_data.loc[option]['STRIKE']<forward*(1+tol)):</pre>
    . . . :
                  imp_vol=bsm_call_imp_vol(
    . . . :
    . . . :
                 options_data.loc[option]['STRIKE'],
    . . . :
                 options_data.loc[option]['TTM'],
    . . . :
    . . . :
                 options_data.loc[option]['PRICE'],
    . . . :
                 sigma est=2.,
    . . . :
                 it=100)
    . . . :
                 options data['IMP VOL'].loc[option]=imp vol
    . . . :
Traceback (most recent call last):
```

```
File "<ipython-input-11-4cb558afb5db>", line 5, in <module>
    imp vol=bsm call imp vol(
NameError: name 'bsm call imp vol' is not defined
In [12]: from bsm functions import *
In [13]: tol=0.5
    ...: for option in options_data.index:
             forward=futures_data[futures_data['MATURITY']==options_data.loc[option]
['MATURITY']]['PRICE'].values[0]
             if(forward*(1-tol)<options_data.loc[option]['STRIKE']<forward*(1+tol)):</pre>
    ...:
                 imp_vol=bsm_call_imp_vol(
    . . . :
    . . . :
                 options_data.loc[option]['STRIKE'],
    . . . :
                 options_data.loc[option]['TTM'],
    . . . :
    . . . :
                 options_data.loc[option]['PRICE'],
    . . . :
                 sigma_est=2.,
    . . . :
                 it=100)
    . . . :
                 options_data['IMP_VOL'].loc[option]=imp_vol
    . . . :
    . . . :
C:\Anaconda\lib\site-packages\pandas\core\indexing.py:115: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
See the the caveats in the documentation: http://pandas.pydata.org/pandas-
docs/stable/indexing.html#indexing-view-versus-copy
  self._setitem_with_indexer(indexer, value)
In [14]: options data.loc[46170]
Out[14]:
             2014-03-31 00:00:00
DATE
EXP YEAR
                             2014
EXP MONTH
                                4
                                C
TYPE
STRIKE
                                1
PRICE
                            16.85
MATURITY
             2014-04-18 00:00:00
TTM
                            0.049
IMP VOL
                                0
Name: 46170, dtype: object
In [15]: plot_data=options_data[options_data['IMP_VOL']>0]
In [16]: maturities=sorted(set(options_data['MATURITY']))
In [17]: maturities
Out[17]:
[Timestamp('2014-04-18 00:00:00'),
Timestamp('2014-05-16 00:00:00'),
Timestamp('2014-06-20 00:00:00'),
Timestamp('2014-07-18 00:00:00'),
Timestamp('2014-08-15 00:00:00'),
Timestamp('2014-09-19 00:00:00'),
Timestamp('2014-10-17 00:00:00'),
Timestamp('2014-11-21 00:00:00')]
In [18]: import matplotlib.pyplot as plt
    ...: %matplotlib inline
    ...: plt.figure(figsize=(8,6))
    ...: for maturity in maturities:
```

```
data=plot data[option data.MATURITY==maturity]
    . . . :
             plt.plot(data['STRIKE'],data['IMP_VOL'],
    . . . :
                   label=maturity.date(), lw=1.5)
    . . . :
             plt.plot(data['STRIKE'],data['IMP_VOL'],'r.')
    . . . :
    ...: plt.grid(True)
    ...: plt.xlabel('Strike')
    ...: plt.ylabel('Implied volatility of volatility')
    ...: plt.legend()
    ...: plt.show()
<matplotlib.figure.Figure at 0x156a1fd0>
Traceback (most recent call last):
  File "<ipython-input-18-63c5a8f9ef0c>", line 5, in <module>
    data=plot_data[option_data.MATURITY==maturity]
NameError: name 'option_data' is not defined
In [19]: import matplotlib.pyplot as plt
    ...: %matplotlib inline
    ...: plt.figure(figsize=(8,6))
    ...: for maturity in maturities:
             data=plot_data[options_data.MATURITY==maturity]
    ...:
             plt.plot(data['STRIKE'],data['IMP_VOL'],
    ...:
                   label=maturity.date(),lw=1.5)
    ...:
    ...:
             plt.plot(data['STRIKE'],data['IMP_VOL'],'r.')
    ...: plt.grid(True)
    ...: plt.xlabel('Strike')
    ...: plt.ylabel('Implied volatility of volatility')
    ...: plt.legend()
    ...: plt.show()
    ...:
C:\Anaconda\lib\site-packages\pandas\core\frame.py:1825: UserWarning: Boolean Series
key will be reindexed to match DataFrame index.
  "DataFrame index.", UserWarning)
```

```
3.0
                                                                                  2014-04-18
                                                                                  2014-05-16
                                                                                  2014-06-20
   2.5
                                                                                  2014-07-18
                                                                                  2014-08-15
Implied volatility of volatility
                                                                                  2014-09-19
                                                                                  2014-10-17
   2.0
                                                                                  2014-11-21
   1.5
   1.0
   0.5 L
                                          15
                        10
                                                             20
                                                                               25
                                                  Strike
```

```
In [20]: keep=['PRICE','IMP_VOL']
```

In [21]: group_data=plot_data.groupby(['MATURITY','STRIKE'])[keep]

In [22]: group_data

Out[22]: <pandas.core.groupby.DataFrameGroupBy object at 0x0000000015C379E8>

In [23]: group_data=group_data.sum()

In [24]: group_data
Out[24]:

		PRICE	IMP_VOL
MATURITY	STRIKE		
2014-04-18	9	8.85	2.083388
	10	7.85	1.804193
	11	6.85	1.550283
	12	5.85	1.316103
	13	4.85	1.097184
	14	3.85	0.889581
	15	2.90	0.748630
	16	2.00	0.630958
	17	1.35	0.639297
	18	0.95	0.703208
	19	0.70	0.775629
	20	0.50	0.818813
	21	0.40	0.892494
	22	0.35	0.981551
	23	0.25	0.995124
	24	0.25	1.101613
	25	0.20	1.133795
	26	0.15	1.144977
2014-05-16	10	9.55	2.583783
	11	8.55	2.287971
	12	7.55	2.019846
	13	6.55	1.772845

```
14
                   5.55 1.541737
          15
                   4.55 1.321948
          16
                   3.65 1.153127
          17
                   2.90 1.042663
          18
                   2.35 0.997287
          19
                   1.90 0.969408
          20
                   1.55 0.958881
          21
                   1.30 0.968536
                    . . .
2014-10-17 21
                   3.05 0.799966
          22
                   2.75 0.793566
          23
                   2.50 0.791992
          24
                   2.25 0.785962
          25
                   2.10 0.795640
          26
                   1.90 0.791735
          27
                   1.75 0.794615
          28
                   1.65 0.805125
          29
                   1.50 0.802227
          30
                   1.40 0.807714
2014-11-21 11
                  10.25 1.491546
          12
                   9.25 1.331759
          13
                   8.30 1.200063
          14
                   7.40 1.090057
          15
                   6.55 0.997041
                   5.80 0.927519
          16
          17
                   5.15 0.877302
                   4.60 0.843453
          18
          19
                   4.10 0.815015
          20
                   3.70 0.800333
                   3.35 0.790023
          21
          22
                   3.05 0.784194
          23
                   2.80 0.783116
                   2.60 0.787200
          24
          25
                   2.40 0.787899
          26
                   2.20 0.785411
                   2.05 0.789241
          27
          28
                   1.95 0.800016
          29
                   1.80 0.798958
          30
                   1.70 0.805459
[158 rows x 2 columns]
In [25]: from bsm_functions import bam_call_value
Traceback (most recent call last):
 File "<ipython-input-25-a29524b20ef1>", line 1, in <module>
   from bsm_functions import bam_call_value
ImportError: cannot import name bam_call_value
In [26]: from bsm_functions import bsm_call_value
In [27]: S0=100
   ...: K=105
    ...: T=1.0
    ...: R=0.05
    ...: sigma=0.2
    ...: bsm_call_value(S0,K,T,r,sigma)
Out[27]: 6.2972545390860333
```

```
In [28]: %run mcs pure python.py
Traceback (most recent call last):
  File "C:\Users\Documents\Python Scripts\mcs_pure_python.py", line 32, in <module>
    print "European Option Value &7.3f" % CO
TypeError: not all arguments converted during string formatting
In [29]: %run mcs_pure_python.py
10.420999262
27.9830000401
In [30]: import numpy as np
In [31]: v=np.arange(1,6)
In [32]: v
Out[32]: array([1, 2, 3, 4, 5])
In [33]: 2*v
Out[33]: array([ 2, 4, 6, 8, 10])
In [34]: %run mcs_vector_numpy.py
8.03650296251
Traceback (most recent call last):
  File "C:\Users\Documents\Python Scripts\mcs vector numpy.py", line 23, in <module>
   print tnp1
NameError: name 'tnp1' is not defined
In [35]: %run mcs_vector_numpy.py
8.03650296251
0.797999858856
In [36]: %run mcs_full_vector_numpy.py
8.16580796626
0.851999998093
In [37]: import matplotlib.pyplot as plt
In [38]: plt.plot(S[:,:10])\
    ...: plt.grid(True)
  File "<ipython-input-38-ddb81aa3585f>", line 1
   plt.plot(S[:,:10])plt.grid(True)
SyntaxError: invalid syntax
In [39]: plt.plot(S[:,:10])
    ...: plt.grid(True)
    ...: plt.xlabel('time step')
    ...: plt.ylabel('index level')
Out[39]: <matplotlib.text.Text at 0x15d51b00>
```

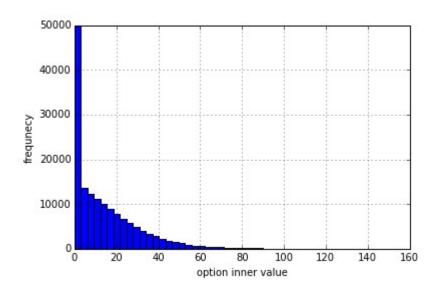
```
150
   140
   130
   120
index level
   110
   100
    90
     80
     70
                                                     30
                                                                    40
                      10
                                     20
                                                                                   50
                                         time step
```

```
In [40]: plt.hist(S[-1],bins=50)
    ...: plt.grid(True)
    ...: plt.xlabel('index_level')
    ...: plt.ylabel('frequency')
Out[40]: <matplotlib.text.Text at 0x151d3da0>
   25000
   20000
   15000
frequency
   10000
    5000
       0
                         100
                                           200
                                                    250
                                                             300
                               index_level
```

```
In [41]: plt.hist(np.maximum(S[-1]-K,0),bins=50)\
    ...: plt.grid(True)
File "<ipython-input-41-50305ff4a9d5>", line 1
    plt.hist(np.maximum(S[-1]-K,0),bins=50)plt.grid(True)
    ^

SyntaxError: invalid syntax

In [42]: plt.hist(np.maximum(S[-1]-K,0),bins=50)
    ...: plt.grid(True)
    ...: plt.xlabel('option inner value')
    ...: plt.ylabel('frequnecy')
    ...: plt.ylim(0,50000)
    ...:
Out[42]: (0, 50000)
```



In [43]: sum(S[-1]<K)
Out[43]: 133533</pre>

In [44]: