

Problems1

April 8, 2016

0.1 General utils

```
In [1]: import sys
        print (sys.version)
        if sys.version_info >= (3,4):
            print( "with enums" )
            from enum import Enum
            class CallPut(Enum):
                call = 1
                put = 2
        else:
            print( "no enums" )
            class CallPut(object):
                __values__ = ['call', 'put']

                def __init__(self, t, s):
                    self.value = t
                    self.str_value = s

                def __eq__(self,y):
                    if type(y) is not self.__class__:
                        return False
                    return self.value == y.value

                def __str__(self):
                    return self.str_value

            @classmethod
            def __enum_init__(cls):
                for i in range(len(cls.__values__)):
                    setattr(cls, cls.__values__[i], CallPut(i+1, cls.__values__[i]))

CallPut.__enum_init__()

t = CallPut.call
print( "Call: %s; Booleans: %r, %r" %(t, CallPut.call == t, CallPut.put == t) )
print( "Wrong type: %r" % (t == 1) )

2.7.10 (default, Dec 28 2015, 04:30:58)
[GCC 5.2.1 20151010]
no enums
```

```
Call: call; Booleans: True, False  
Wrong type: False
```

```
In [2]: import numpy as np  
import pandas as pd  
import matplotlib.pyplot as plt  
%matplotlib inline  
  
import math as m  
from time import time  
from scipy import stats  
import scipy as sp  
  
In [3]: def N(x):  
    return stats.norm.cdf(x, 0.0, 1.0)  
  
def NPrime(x):  
    return stats.norm.pdf(x, 0.0, 1.0)  
  
def bsm_d1(S, K, T, r, q, sigma):  
    S = float(S)  
    return (m.log(S / K) + (r - q + 0.5 * sigma ** 2) * T) / (sigma * m.sqrt(T))  
  
def bsm_d2(S, K, T, r, q, sigma):  
    S = float(S)  
    return (m.log(S / K) + (r - q - 0.5 * sigma ** 2) * T) / (sigma * m.sqrt(T))  
  
def bsm_pv(callPutType, S, K, T, r, q, sigma):  
    d1 = bsm_d1(S, K, T, r, q, sigma)  
    d2 = bsm_d2(S, K, T, r, q, sigma)  
    if CallPut.call == callPutType:  
        return S * N(d1) * m.exp(-q * T) - K * m.exp(-r * T) * N(d2)  
    else:  
        return K * N(-d2) * m.exp(-r * T) - S * m.exp(-q * T) * N(-d1)  
  
def bsm_delta(callPutType, S, K, T, r, q, sigma):  
    d1 = bsm_d1(S, K, T, r, q, sigma)  
    if CallPut.call == callPutType:  
        return N(d1) * m.exp(-q * T)  
    else:  
        return -N(-d1) * m.exp(-q * T)  
  
def bsm_gamma(callPutType, S, K, T, r, q, sigma):  
    d2 = bsm_d1(S, K, T, r, q, sigma)  
    return NPrime(d2) * m.exp(-q * T) / (S * sigma * m.sqrt(T))  
  
def bsm_vega(callPutType, S, K, T, r, q, sigma):  
    d1 = bsm_d1(S, K, T, r, q, sigma)  
    return S * NPrime(d1) * m.sqrt(T)
```

```
In [4]: K=90; T=0.5  
S=100; sigma=0.2; q=0; r=0.05  
print("Call: pv=% .5f, delta % .5f, vega: % .5f, gamma: % .5f" % (
```

```

        bsm_pv(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
        bsm_delta(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
        bsm_vega(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
        bsm_gamma(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
    ))
print("Put: pv=% .5f, delta % .5f, vega: % .5f, gamma: % .5f" % (
    bsm_pv(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_delta(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_vega(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_gamma(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
))

```

Call: pv=13.49852, delta 0.83952, vega: 17.23826, gamma: 0.01724
Put: pv=1.27641, delta -0.16048, vega: 17.23826, gamma: 0.01724

In [5]: K=100; T=1.

```

S=100; sigma=0.2; q=0; r=0.05
print("Call: pv=% .5f, delta % .5f, vega: % .5f, gamma: % .5f" % (
    bsm_pv(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_delta(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_vega(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_gamma(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
))
print("Put: pv=% .5f, delta % .5f, vega: % .5f, gamma: % .5f" % (
    bsm_pv(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_delta(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_vega(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma),
    bsm_gamma(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
))

```

Call: pv=10.45058, delta 0.63683, vega: 37.52403, gamma: 0.01876
Put: pv=5.57353, delta -0.36317, vega: 37.52403, gamma: 0.01876

0.2 Find spot value for given value of delta

0.2.1 delta neutral position

```

In [6]: def find_strike_for_delta(callPutType, S, T, r, q, sigma, target_delta):
    y = lambda x: bsm_delta(callPutType, S=S, K=x, T=T, r=r, q=q, sigma=sigma) - target_delta
    K_ = sp.optimize.brentq(y, 1e-10, S*10.)
    print( "Strike value %.8f" % K_ )
    print( "Call delta: %.8f, gamma %.8f" % (
        bsm_delta(CallPut.call, S=S, K=K_, T=T, r=r, q=q, sigma=sigma),
        bsm_gamma(CallPut.call, S=S, K=K_, T=T, r=r, q=q, sigma=sigma)
    ))
    print( "Put delta: %.8f, gamma %.8f" % (
        bsm_delta(CallPut.put, S=S, K=K_, T=T, r=r, q=q, sigma=sigma),
        bsm_gamma(CallPut.put, S=S, K=K_, T=T, r=r, q=q, sigma=sigma)
    ))

```

In [7]: T=9./12.; S=100.; sigma=0.2; q=0; r=0.05

```
find_strike_for_delta(CallPut.call, S=S, T=T, r=r, q=q, sigma=sigma, target_delta=0.5)
```

```
Strike value 105.39025621
Call delta: 0.50000000, gamma 0.02303294
Put delta: -0.50000000, gamma 0.02303294
```

```
In [8]: T=9./12.; S=100.; sigma=0.2; q=0.02; r=0.05
```

```
    find_strike_for_delta(CallPut.call, S=S, T=T, r=r, q=q, sigma=sigma, target_delta=0.5)
```

```
Strike value 103.48112615
Call delta: 0.50000000, gamma 0.02268596
Put delta: -0.48511194, gamma 0.02268596
```

0.2.2 delta .25 for call

```
In [9]: find_strike_for_delta(CallPut.call, S=S, T=T, r=r, q=q, sigma=sigma, target_delta=0.25)
```

```
Strike value 116.44790994
Call delta: 0.25000000, gamma 0.01821736
Put delta: -0.73511194, gamma 0.01821736
```

0.2.3 delta .25 for put

```
In [10]: find_strike_for_delta(CallPut.put, S=S, T=T, r=r, q=q, sigma=sigma, target_delta=-0.25)
```

```
Strike value 92.56363223
Call delta: 0.73511194, gamma 0.01821736
Put delta: -0.25000000, gamma 0.01821736
```

0.2.4 NB

the Newton method doesn't work here

```
In [11]: target_delta = 0.5
t = CallPut.call
```

```
y = lambda x: bsm_delta(callPutType=t, S=S, K=x, T=T, r=r, q=q, sigma=sigma) - target_delta
dy = lambda x: bsm_gamma(callPutType=t, S=S, K=x, T=T, r=r, q=q, sigma=sigma)
sp.optimize.newton(y, S, fprime = dy)
```

```
-----
ValueError                                     Traceback (most recent call last)
```

```
<ipython-input-11-d00901f0280d> in <module>()
  4 y = lambda x: bsm_delta(callPutType=t, S=S, K=x, T=T, r=r, q=q, sigma=sigma) - target_delta
  5 dy = lambda x: bsm_gamma(callPutType=t, S=S, K=x, T=T, r=r, q=q, sigma=sigma)
--> 6 sp.optimize.newton(y, S, fprime = dy)
```

```
/projects/sage/sage-6.10/local/lib/python2.7/site-packages/scipy/optimize/zeros.pyc in newton(f,
   128         for iter in range(maxiter):
   129             myargs = (p0,) + args
--> 130             fder = fprime(*myargs)
   131             if fder == 0:
   132                 msg = "derivative was zero."
```

```

<ipython-input-11-d00901f0280d> in <lambda>(x)
    3
    4 y = lambda x: bsm_delta(callPutType=t, S=S, K=x, T=T, r=r, q=q, sigma=sigma) - target_delta
--> 5 dy = lambda x: bsm_gamma(callPutType=t, S=S, K=x, T=T, r=r, q=q, sigma=sigma)
    6 sp.optimize.newton(y, S, fprime = dy)

<ipython-input-3-1d339f6e0483> in bsm_gamma(callPutType, S, K, T, r, q, sigma)
    29
    30 def bsm_gamma(callPutType, S, K, T, r, q, sigma):
--> 31     d2 = bsm_d1(S, K, T, r, q, sigma)
    32     return NPrime(d2) * m.exp(-q * T) / (S * sigma * m.sqrt(T))
    33

<ipython-input-3-1d339f6e0483> in bsm_d1(S, K, T, r, q, sigma)
    7 def bsm_d1(S, K, T, r, q, sigma):
    8     S = float(S)
--> 9     return (m.log(S / K) + (r - q + 0.5 * sigma ** 2) * T) / (sigma * m.sqrt(T))
    10
    11 def bsm_d2(S, K, T, r, q, sigma):

ValueError: math domain error

```

1 Monte Carlo

1.1 for European

Call / Put, $q \neq 0$

```

In [12]: def mc_euro_pv(callPutType, S0, K, T, r, q, sigma, M, I):
            # Simulating I paths with M time steps
            S = np.zeros((M + 1, I))
            S[0] = S0
            dt = float(T) / M
            for t in range(1, M + 1):
                z = np.random.standard_normal(I)
                mean = np.mean(z)
                std = np.std(z)
                z = (z - mean) / std
                S[t] = S[t - 1] * np.exp((r - q) - 0.5 * sigma ** 2) * dt + sigma * m.sqrt(dt) * z

            # Calculating the Monte Carlo estimator
            if CallPut.call == callPutType:
                C = m.exp(-r * T) * np.sum(np.maximum(S[-1] - K, 0)) / I
            else:
                C = m.exp(-r * T) * np.sum(np.maximum(K - S[-1], 0)) / I
            return C, S

```

```

# Parameters
S = 80.; K = 85.; T = 1.0; r = 0.05; q = 0.02; sigma = 0.2
M = 360; I = 50000

np.random.seed(12345)
t0 = time()
C, SPaths = mc_euro_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma, M=M, I=I)
calcTime = time() - t0

ref_pv = bsm_pv(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
ref_delta = bsm_delta(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
print( "ref_pv: %.6f, ref_delta: %.6f" % (ref_pv, ref_delta) )

print( "PV: %.5f, abs diff: %.5f, rel diff: %.5f" % (C, ref_pv - C, (ref_pv - C)/C) )
print( "Calculation time %.5f" % calcTime )

ref_pv: 5.198058, ref_delta: 0.469336
PV: 5.18811, abs diff: 0.00995, rel diff: 0.00192
Calculation time 1.56068

In [13]: np.random.seed(12345)
t0 = time()
C, SPaths = mc_euro_pv(CallPut.put, S0=S, K=K, T=T, r=r, q=q, sigma=sigma, M=M, I=I)
calcTime = time() - t0

ref_pv = bsm_pv(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
ref_delta = bsm_delta(CallPut.put, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
print( "ref_pv: %.6f, ref_delta: %.6f" % (ref_pv, ref_delta) )

print( "PV: %.5f, abs diff: %.5f, rel diff: %.5f" % (C, ref_pv - C, (ref_pv - C)/C) )
print( "Calculation time %.5f" % calcTime )

ref_pv: 7.636666, ref_delta: -0.510863
PV: 7.62543, abs diff: 0.01123, rel diff: 0.00147
Calculation time 1.71575

```

1.2 for Barrier

In [14]: SPaths[0:2]

```

Out[14]: array([[ 80.          ,  80.          ,  80.          , ...,
   80.          ,  80.          ],
   [ 79.83177552,  80.40754091,  79.56809924, ...,
   78.34882432,
   78.2206164 ,  79.71675684]])

```

```

In [15]: def mc_up_bar_pv(callPutType, S0, K, T, r, q, sigma, bar, M, I):
    # Simulating I paths with M time steps
    S = np.zeros((M + 1, I))
    S[0] = S0
    dt = float(T) / M
    for t in range(1, M + 1):
        z = np.random.standard_normal(I)
        mean = np.mean(z)
        std = np.std(z)
        z = (z - mean)/std

```

```

Snext = S[t - 1] * np.exp((r - q) - 0.5 * sigma ** 2) * dt + sigma * m.sqrt(dt) * z
Snext[ Snext > bar ] = 0.
S[t] = Snext

# Expected payoff
E = np.sum(np.maximum(S[-1] - K, 0)) / I
# PV
C = m.exp(-r * T) * E

return C, S

# Parameters
S = 80.; K = 85.; T = 1.0; r = 0.05; q = 0.02; sigma = 0.2;
bar = 100
M = 360; I = 50000

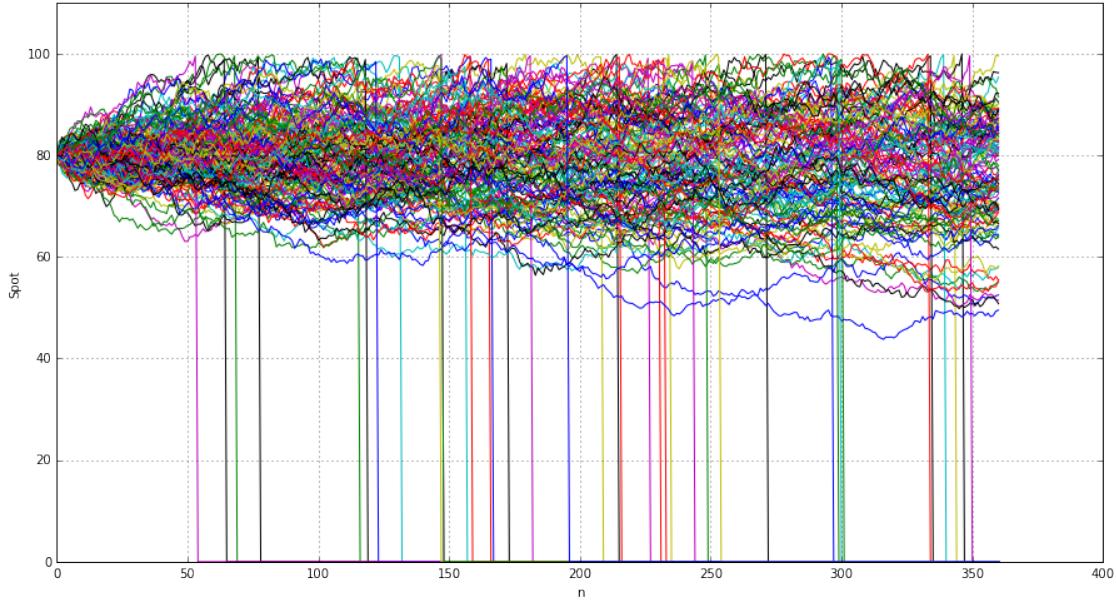
np.random.seed(12345)
t0 = time()
C, SPaths = mc_up_bar_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma, bar=bar, M=M, I=I)
calcTime = time() - t0

print( "PV: %.5f" % (C) )
print( "Calculation time    %.5f" % calcTime )

PV: 0.77395
Calculation time    1.50975

In [16]: plt.figure(figsize=(15,8))
plt.plot(SPaths[:, :150])
plt.grid(True)
plt.xlabel('n')
plt.ylabel('Spot')
plt.ylim([0, bar+10])
plt.show()

```



```
In [20]: ref_pv = bsm_pv(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
ref_vega = bsm_vega(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
print( "ref_pv: %.6f, ref_vega: %.6f" % (ref_pv, ref_vega) )

np.random.seed(12345)
t0 = time()
C, SPaths = mc_up_bar_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma, bar=S*100, M=M, I=I)
calcTime = time() - t0

print( "PV: %.5f, abs diff: %.5f, rel diff: %.5f" % (C, ref_pv - C, (ref_pv - C)/C) )
print( "Calculation time %.5f" % calcTime )

ref_pv: 5.198058, ref_vega: 31.870381
PV: 5.18811, abs diff: 0.00995, rel diff: 0.00192
Calculation time 1.57727

In [49]: dsigma = sigma / 10.
S = 80.; K = 80.; T = 1.0; r = 0.05; q = 0.02; sigma = 0.2;
bar = 150.

np.random.seed(12345)
t0 = time()
C_1, _ = mc_up_bar_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma-dsigma, bar=bar, M=M, I=I)
C1, _ = mc_up_bar_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma+dsigma, bar=bar, M=M, I=I)
vega = (C1 - C_1) / (2. * dsigma)
calcTime = time() - t0

print( "Vega: %.5f" % (vega) )
print( "Calculation time %.5f" % calcTime )

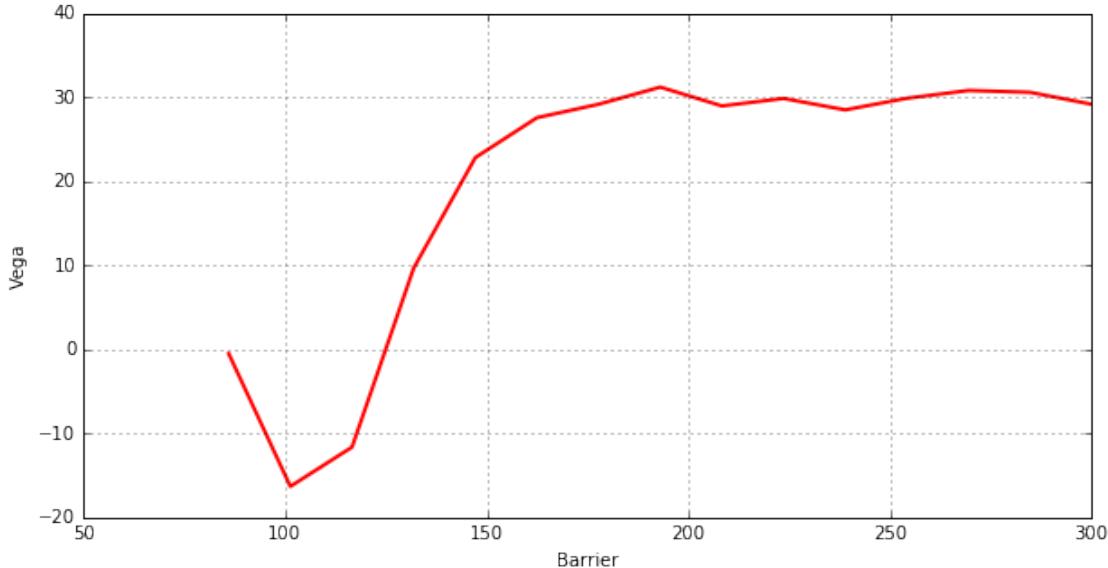
Vega: 23.00726
Calculation time 3.44547
```

```
In [52]: def mc_up_bar_vega(x):
    C_1, _ = mc_up_bar_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma-dsigma, bar=x, M=M)
    C1, _ = mc_up_bar_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma+dsigma, bar=x, M=M)
    vega = (C1 - C_1) / (2. * dsigma)
    return vega

x = np.linspace(86, 300, num=15)
y = [mc_up_bar_vega(i) for i in x]

lw = 2.0
```

```
In [53]: plt.figure(figsize=(10,5))
plt.plot(x, y, 'r', linewidth=lw)
axes = plt.gca()
axes.set_xlabel('Barrier')
axes.set_ylabel('Vega')
plt.grid(True)
plt.show()
```



1.2.1 for Asian option

```
In [55]: def mc_asian_pv(callPutType, S0, K, T, r, q, sigma, M, I):
    # Simulating I paths with M time steps
    S = np.zeros((M + 1, I))
    S[0] = S0
    dt = float(T) / M
    for t in range(1, M + 1):
        z = np.random.standard_normal(I)
        mean = np.mean(z)
        std = np.std(z)
        z = (z - mean)/std
        S[t] = S[t - 1] * np.exp(( (r - q) - 0.5 * sigma ** 2) * dt + sigma * np.sqrt(dt) * z)
```

```

# Expected payoff
E = np.sum( np.maximum( np.apply_along_axis(np.sum, 0, S) / M - K, 0 ) ) / I #np.sum(np.ma
# PV
C = m.exp(-r * T) * E

return C, S

# Parameters
S = 80.; K = 80.; T = 2./12.; r = 0.05; q = 0.02; sigma = 0.2;
M = 360; I = 50000

np.random.seed(12345)
t0 = time()
C, SPaths = mc_asian_pv(CallPut.call, S0=S, K=K, T=T, r=r, q=q, sigma=sigma, M=M, I=I)
calcTime = time() - t0

print( "PV: %.5f" % (C) )
print( "Calculation time %.5f" % calcTime )

PV: 1.72025
Calculation time 1.97063

In [56]: ref_pv = bsm_pv(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
ref_vega = bsm_delta(CallPut.call, S=S, K=K, T=T, r=r, q=q, sigma=sigma)
print( "ref_pv: %.6f, ref_delta: %.6f" % (ref_pv, ref_vega) )

print( "PV: %.5f, abs diff: %.5f, rel diff: %.5f" % (C, ref_pv - C, (ref_pv - C)/C) )

ref_pv: 2.793701, ref_delta: 0.538847
PV: 1.72025, abs diff: 1.07345, rel diff: 0.62401

In []:

```