```
In [1]:
        import numpy as np
         import pandas as pd
In [2]: def EGBM(K):
             alpha=0.05
             #mu = -0.45
             sig=1
             So=100
             T=4
             x=np.random.normal(size=100000)
             S=So*np.exp((alpha-sig/2)*T + sig*np.sqrt(T)*x)
             B=np.exp(-alpha*T)*(S-K)
             C vec=B
             C_vec=np.where(C_vec>0,C_vec,0)
             return(C_vec)
In [3]: np.std(EGBM(80))
Out[3]: 665.4505154012433
In [4]: np.std(EGBM(100))
Out[4]: 536.6771004817291
In [5]:
       np.std(EGBM(120))
Out[5]: 855.0827137504558
In [6]:
        def AntitheticEGBM(K):
             alpha=0.05
             #mu = -0.45
             sig=1
             So=100
             T=4
             x=np.random.normal(size=100000)
             S=So*np.exp((alpha-sig/2)*T + sig*np.sqrt(T)*x)
             S_ne=So*np.exp((alpha-sig/2)*T + sig*np.sqrt(T)*(-x))
             B=np.exp(-alpha*T)*(S-K)
             B_ne=np.exp(-alpha*T)*(S_ne-K)
             C=sum(np.where(B>0,B,0))
             C=C+sum(np.where(B ne>0,B ne,0))
             C_vec=np.where(B_ne>0,B_ne,0)+np.where(B>0,B,0)
             C_vec=np.where(C_vec>0,C_vec/2,0)
             return(C_vec)
In [7]: | np.std(AntitheticEGBM(80))
```

localhost:8888/notebooks/Monte Carlo Hw 10.ipynb#

Out[7]: 467.1931607070753

```
In [8]: | np.std(AntitheticEGBM(100))
Out[8]: 457.82138774020547
In [9]: np.std(AntitheticEGBM(120))
Out[9]: 493.6409989370343
In [10]: def AGBM(K):
             alpha=0.05
             \#mu = -0.45
             sig=1
             So=100
             dT = 0.01
             T=4
             S=np.repeat(So, 100000)
             t=np.linspace(0.01,T,num=400)
             ST=[]
             ST.append(S)
             for i in t:
                  Vec=np.random.normal(size=100000)
                  S=S*np.exp((alpha-sig/2)*dT+sig*np.sqrt(dT)*Vec)
                  ST.append(S)
             test=np.array(ST)
             S_bar=np.mean(test,axis=0)
             B=np.exp(-alpha*T)*(S_bar-K)
             C=np.where(B>0,B,0)
             return(C)
In [11]: np.std(AGBM(80))
Out[11]: 206.29030970235738
In [12]: np.std(AGBM(100))
Out[12]: 224.87447481711393
In [13]: | np.std(AGBM(120))
Out[13]: 197.62470951865345
```

```
In [14]: def AGBM anti(K):
             alpha=0.05
             #mu = -0.45
             sig=1
             So=100
             dT=0.01
             T=4
             S=np.repeat(So, 100000)
             S ne=np.repeat(So,100000)
             t=np.linspace(0.01,T,num=400)
             ST=[]
             ST_ne=[]
             ST.append(S)
             ST.append(S ne)
             for i in t:
                 Vec=np.random.normal(size=100000)
                  S=S*np.exp((alpha-sig/2)*dT+sig*np.sqrt(dT)*Vec)
                 S_ne=S_ne*np.exp((alpha-sig/2)*dT+sig*np.sqrt(dT)*(-Vec))
                  ST.append(S)
                  ST ne.append(S ne)
             test=np.array(ST)
             test ne=np.array(ST ne)
             S_bar=np.mean(test,axis=0)
             S_bar_ne=np.mean(test_ne,axis=0)
             B=np.exp(-alpha*T)*(S bar-K)
             B ne=np.exp(-alpha*T)*(S bar ne-K)
             C=(np.where(B>0,B,0)+np.where(B_ne>0,B_ne,0))/2
             return(C)
In [15]: | np.std(AGBM_anti(80))
Out[15]: 129.32659457705202
In [16]: np.std(AGBM_anti(100))
Out[16]: 139.04517758906402
In [17]: np.std(AGBM_anti(120))
Out[17]: 144.87762694597055
```

```
In [18]: def LGBM():
              alpha=0.05
              #mu = -0.45
              sig=1
              So=100
              dT = 0.01
              T=4
             S=np.repeat(So,100000)
             t=np.linspace(0.01,4,num=400)
             ST=[]
             ST.append(S)
             for i in t:
                  Vec=np.random.normal(size=100000)
                  S=S*np.exp((alpha-sig/2)*dT+sig*np.sqrt(dT)*Vec)
                  ST.append(S)
             test=np.array(ST)
             S=np.min(test,axis=0)
             ST=test[400,:]
              B=np.exp(-alpha*T)*(ST-S)
             C=np.where(B>0,B,0)
              return(C)
```

```
In [19]: np.std(LGBM())
```

Out[19]: 652.378264570656

```
In [20]: def LGBM anti():
             alpha=0.05
             #mu = -0.45
             sig=1
             So=100
             dT=0.01
             T=4
             S=np.repeat(So, 100000)
             S ne=np.repeat(So,100000)
             t=np.linspace(0.01,4,num=400)
             ST=[]
             ST_ne=[]
             ST.append(S)
             ST ne.append(S ne)
             for i in t:
                  Vec=np.random.normal(size=100000)
                  S=S*np.exp((alpha-sig/2)*dT+sig*np.sqrt(dT)*Vec)
                  S_ne=S_ne*np.exp((alpha-sig/2)*dT+sig*np.sqrt(dT)*(-Vec))
                  ST.append(S)
                  ST ne.append(S ne)
             test=np.array(ST)
             test ne=np.array(ST ne)
             S=np.min(test,axis=0)
             S_ne=np.min(test_ne,axis=0)
             ST=test[400,:]
             ST ne=test ne[400,:]
             B=np.exp(-alpha*T)*(ST-S)
             B ne=np.exp(-alpha*T)*(ST ne-S ne)
             C=(np.where(B>0,B,0) + np.where(B_ne>0,B_ne,0))/2
             return(C)
In [21]: np.std(LGBM anti())
Out[21]: 433.30280256436953
In [22]: def pilot_crack(rho,K):
             r=0.05
             X0=50
             Y0=45
             sigx=0.2
             sigy=0.3
             T=1
             mean=[0,0]
             cov=[[1,rho],[rho,1]]
             x,y=np.random.multivariate normal(mean,cov,10000).T
             XT=X0*np.exp((r-sigx/2)*T+sigx*x)
             YT=Y0*np.exp((r-sigy/2)*T+sigy*y)
             B=np.exp(-r*T)*(XT-YT-K)
             C=np.where(B>0,B,0)
             return(np.cov(C,x))
```

```
In [23]: pilot_crack(0.5,0)
Out[23]: array([[60.53862953,
                              2.82262196],
                               0.98902203]])
                [ 2.82262196,
In [24]:
         pilot_crack(0.5,5)
Out[24]: array([[41.28441538,
                               2.51240479],
                [ 2.51240479,
                               1.00315108]])
In [25]:
         pilot_crack(0.5,10)
Out[25]: array([[22.6505033],
                               1.82793826],
                [ 1.82793826,
                               0.98585485]])
In [26]:
         def crack(rho,K):
             r=0.05
             X0=50
             Y0=45
             sigx=0.2
             sigy=0.3
             T=1
             mean=[0,0]
             cov=[[1,rho],[rho,1]]
             x,y=np.random.multivariate_normal(mean,cov,10000).T
             XT=X0*np.exp((r-sigx/2)*T+sigx*x)
             YT=Y0*np.exp((r-sigy/2)*T+sigy*y)
             B=np.exp(-r*T)*(XT-YT-K)
             C=np.where(B>0,B,0)
             return(C)
In [27]: | np.std(crack(0.5,0))
Out[27]: 7.82572128045003
In [28]:
         np.std(crack(0.5,5))
Out[28]: 6.344230381324534
In [29]: np.std(crack(0.5,10))
Out[29]: 4.828932903274982
```

```
In [30]:
         def crack1(rho,K):
              r=0.05
             X0=50
              Y0=45
              sigx=0.2
              sigy=0.3
             T=1
              mean=[0,0]
              cov=[[1,rho],[rho,1]]
              x,y=np.random.multivariate_normal(mean,cov,10000).T
              XT=X0*np.exp((r-sigx/2)*T+sigx*x)
              YT=Y0*np.exp((r-sigy/2)*T+sigy*y)
              B=np.exp(-r*T)*(XT-YT-K)
              C=np.where(B>0,B,0)+C*x
              return(C)
```

```
In [31]: np.std(crack1(0.5,0))
```

```
UnboundLocalError
                                          Traceback (most recent call last)
<ipython-input-31-fe9c9cd9a299> in <module>()
----> 1 np.std(crack1(0.5,0))
<ipython-input-30-9b7b6025985b> in crack1(rho, K)
     12
            YT=Y0*np.exp((r-sigy/2)*T+sigy*y)
     13
            B=np.exp(-r*T)*(XT-YT-K)
---> 14
            C=np.where(B>0,B,0)+C*x
     15
            return(C)
```

UnboundLocalError: local variable 'C' referenced before assignment

```
In [32]: def M_iid_gen():
              Sum=[0]
              while(True):
                  x=np.random.uniform()
                  if(x>Sum[-1]):
                      Sum.append(x);
                  else:
                      break;
              return(len(Sum))
         def M_iid_gen_2():
              Sum_anti=[1]
              while(True):
                  x=np.random.uniform()
                  if((1-x)<Sum_anti[-1]):</pre>
                      Sum anti.append((1-x))
                  else:
                      break;
              return(len(Sum anti))
         Sum=[] # Without Antithetic
         Sum_anti=[] # With antithetic
         for i in range(0,10000):
              Sum.append(M iid gen())
              Sum_anti.append((M_iid_gen()+M_iid_gen_2())/2)
         X1=np.array(Sum)
         X2=np.array(Sum_anti)
In [33]: X1.std()
Out[33]: 0.8677831756838802
In [34]: X2.std()
Out[34]: 0.6133836972075472
In [35]: def int_esti():
              x=np.random.uniform(size=10000)
              return(np.exp(x**2))
In [36]: X=int_esti()
In [37]: X.mean()
Out[37]: 1.452123699216208
```

```
In [38]: | X.std()
Out[38]: 0.46934698660876467
In [39]:
         def int est 2():
              x1=np.random.uniform(size=10000)
              x2=1-x1
              return((np.exp(x1**2)+np.exp(x2**2))/2)
         X=int_est_2()
In [40]: | X.mean()
Out[40]: 1.462367913466333
In [41]: X.std()
Out[41]: 0.1665324869562846
In [42]: def pilot():
              y=np.random.uniform(size=10000)
              x=np.exp(y**2)
              co=np.cov(x,y)
              va=np.var(y)
              return(-co/va)
In [43]: | pilot()
Out[43]: array([[-2.72291863, -1.54083002],
                 [-1.54083002, -1.00010001]])
In [44]: def con_var():
              x=np.uniform.random(size=10000)
              Cont=np.exp(x**2)-1.5367*(x-0.5)
              return(np.mean(Cont))
```