## Question 1:

**Antithetic Sampling**: We can purposely try to induce negative correlation among the variables X1, . . . , Xn, or generate copies that while having the same mean, have a smaller variance, so that the variance of the estimator in X1 = sum(Xi,n), becomes smaller than  $(\sigma^2)/n$ , resulting in a smaller confidence interval. The idea is to try to get even better estimates by reducing the uncertainty in our estimate. Antithetic sampling works like this:

Suppose you would like to estimate, X = E(Y), therefore for Y1,Y2.

The unbiased estimate will be X = [E(Y1) + E(Y2)]/2.

And the variance will be var = [Var(Y1)+Var(Y2) + 2\*Covar(Y1,Y2)]/2

So the variance is reduced when the Covariance is reduced, that's why we take samples like this : {Y1,Y2,.....} and {-Y1, -Y2}.

**Experiment results**: With Antithetic the value started converging from 256 paths while without antithetic results it took 2048 paths

CALL

Enter expiry:2 Enter Strike:100 Enter spot: 120 Enter vol: 0.13 Enter r: 0.10 Enter Number of paths: 100000

Antithetic- Num of Paths	Without Antithetic - Num of Paths
89.5849 2	7.08699 2
64.1036 4	25.0471 4
50.3544 8	26.2534 8
44.1451 16	31.4175 16
41.3126 32	35.4511 32
39.8516 64	37.8828 64
38.9911 128	38.5391 128
38.9035 256	39.3641 256
38.6539 512	37.7306 512
38.3874 1024	37.8539 1024
38.2028 2048	38.3688 2048
38.279 4096	38.1529 4096
38.2924 8192	38.4519 8192
38.3219 16384	38.37 16384
38.2954 32768	38.2571 32768
38.248 65536	38.2953 65536
38.248 100000	38.2603 100000

## Q2:

The Boost Library use the Mersenne Twister as a random generator, which is highly regarded for its performance and high quality pseudo-random numbers. It was designed with statistical simulations in mind, and should therefore be quite good for Monte Carlo simulations, probabilistic algorithms and so on.

Creating the MT random generator on the lines of park miller, i.e inheriting RandomBase class, and using the adapter pattern. To use the adapter pattern simply means to use an intermediary class which transforms one interface into another.

```
43 class RandomMersenneTwister : public RandomBase
44 {
45 public:
46
       RandomMersenneTwister(unsigned long Dimensionality, unsigned long Seed = 12411);
48
     virtual RandomBase* clone() const;
49
50
     virtual void Skip(unsigned long numberOfPaths);
51
     virtual void SetSeed(unsigned long Seed);
52
     virtual void Reset();
53
     virtual void ResetDimensionality(unsigned long NewDimensionality);
     virtual void GetUniforms(MJArray& variates);
     virtual void GetUniforms(vector<double>& variates, double a = 0.0, double b = 1.0);
     virtual void GetGaussians(MJArray& variates);
59
     virtual void GetGaussians(vector<double>& variates, double m = 0.0, double s = 1.0);
60
61
     virtual void GetLogNormals(double m, double s, vector<double>& variates);
62
     virtual void GetExponentials(double lambda, vector<double>& variates);
63
      virtual void GetPoissons(double lambda, vector<double>& variates);
      virtual void GetGammas(double alpha, double beta, vector<double>& variates);
     virtual void GetBetas(double alpha, double beta, vector<double>& variates);
68 private:
     MersenneTwister InnerGenerator;
69
      unsigned long InitialSeed;
70
71 };
72 #endif /* MersenneTwister h */
```

Verified by validating the the Call option values generated from ParkMuller and Mersene Twister.

```
79
80
81
82
        RandomParkMiller generator(1);
83
84
        RandomMersenneTwister generator1(1);
85
        AntiThetic GenTwo(generator);
86
87
        // for call option
88
        SimpleMonteCarlo6(theOption,
89
90
                           Spot,
91
                           VolParam,
92
                           rParam,
93
                           NumberOfPaths,
94
                           gathererTwo,
95
                           generator);
        vector<vector<double> > results = gathererTwo.GetResultsSoFar();
96
97
98
        cout <<"\nFor the call price the results are \n";</pre>
        for (unsigned long i=0; i < results.size(); i++)</pre>
99
100
101
             for (unsigned long j=0; j < results[i].size(); j++)
102
                cout << results[i][j] << " ";
            cout << "\n";
103
        }
104
105
106
107
        double tmp;
108
109
        cin >> tmp;
110
111
        return 0;
112
113 }
114
```

## Values:

MT	ParkMuller
For the call price the results are	For the call price the results are
35.8481 2	10.3592 2
35.3401 4	28.9389 4
36.1903 8	30.999 8
40.3633 16	36.2255 16
39.0092 32	40.0105 32
45.3174 64	42.464 64
45.6874 128	43.0846 128
44.7761 256	43.8838 256
44.5549 512	42.3815 512
42.7831 1024	42.5391 1024
42.7362 2048	43.0221 2048
43.1412 4096	42.8154 4096
43.0818 8192	43.0918 8192

42.9914 100000 42.9258 100000	43.0679 32768 42.9823 65536 4	43.0219 16384 42.9254 32768 42.9556 65536 42.9258 100000
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