

(1) Make sure A part matrix has only negative eigenvalues. The largest eigenvalue is -0.1.

$$A = \begin{bmatrix} -2.1 & 1 & 0 & 0 & \dots & 0 \\ 1 & -2.1 & 1 & 0 & \dots & 0 \\ \dots & \dots & \dots & \dots & \dots & \dots \\ 0 & 0 & 0 & 0 & \dots & 1 \end{bmatrix} \quad (1)$$

We attempt to have a stable as the following energy, we cut the first [0,20] data off, only keep the stationary part.

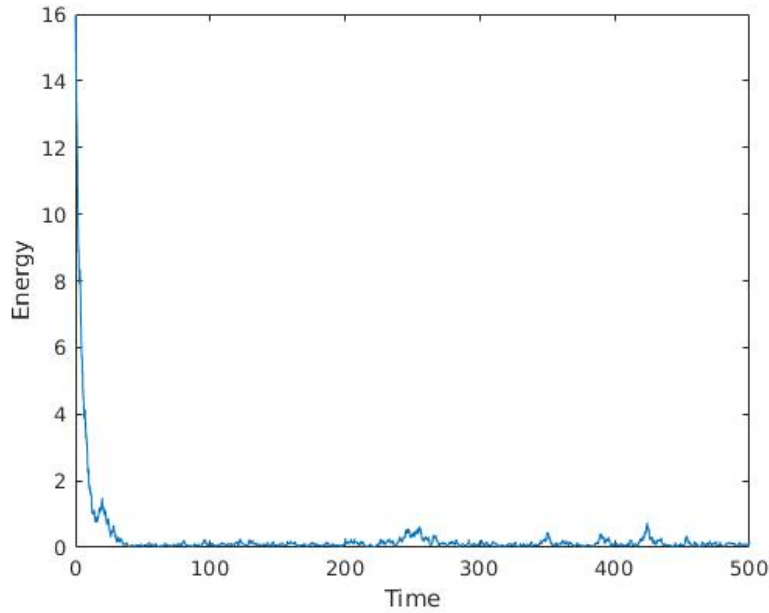


Figure 1: Energy

(2) Same Trend, different  $\Delta t$

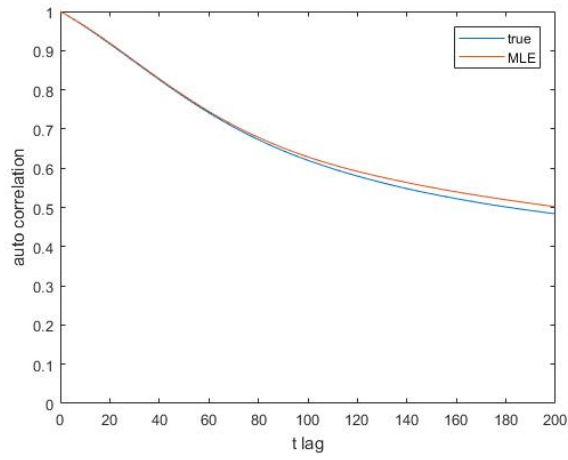
Fixed Trend=500. Fix the calculation time step = 0.001 in the generation, store data with different frequency (5,10,50), so that we have observation with different  $\Delta t = 0.005, 0.01, 0.05$ . In the auto-correlation plot, keep the maximum time lag is 1, such that  $1 = 200 \times 0.005 = 100 \times 0.01 = 20 \times 0.05$ .

- $\Delta t = 0.005$
- $\Delta t = 0.01$
- $\Delta t = 0.05$

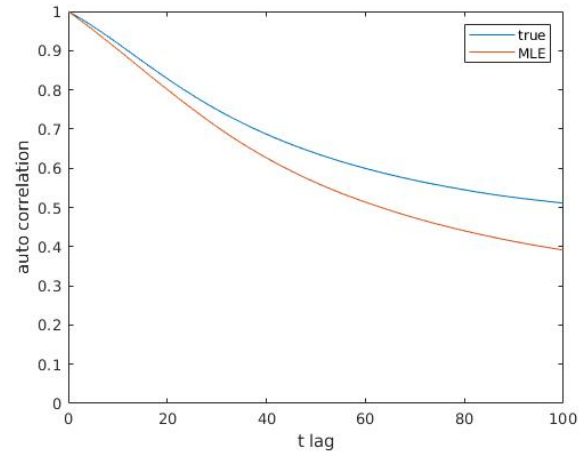
Figure 2: Energy

	mean	variance	the 3rd moment	the 4th moment
Trend=500; dt=0.005; true	-0.0116	0.0070	0.0001	0.0001
Trend=500; dt=0.005, MLE	-0.0213	0.0071	0.0002	0.0002
Trend=500;dt=0.01, true	-0.0246	0.0075	0.0002	0.0002
Trend=500;dt=0.01, MLE	0.0080	0.0055	0.0000	0.0001
Trend=500; dt=0.05,true	-0.0007	0.0072	0.0001	0.0002
Trend=500; dt=0.05,MLE	-0.0172	0.0050	0.0000	0.0001

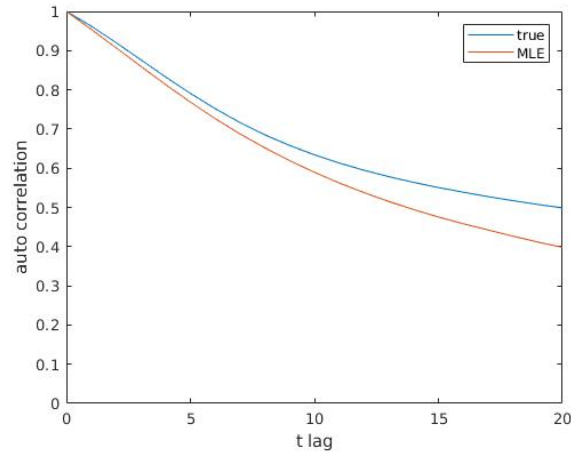
Table 1: statistics



(a) Trend= 500,dt=0.005



(b) Trend= 500,dt=0.01



(c) Trend= 500,dt=0.05

Figure 3: Same Trend, different dt

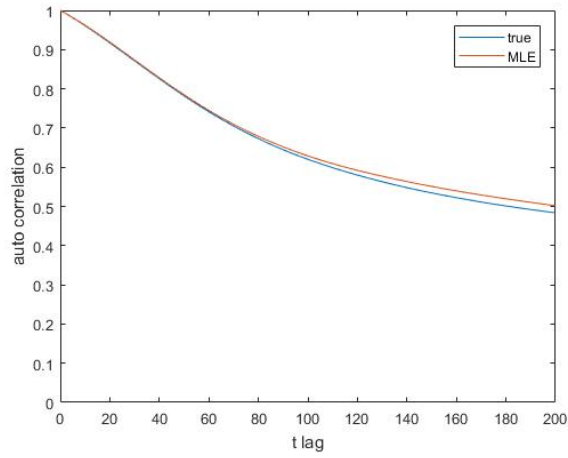
### (3) Same Data Size, different $\Delta t$

It may also cause by the reduced data size. If we increase the Trend with smaller  $\Delta t$ , to have same data size

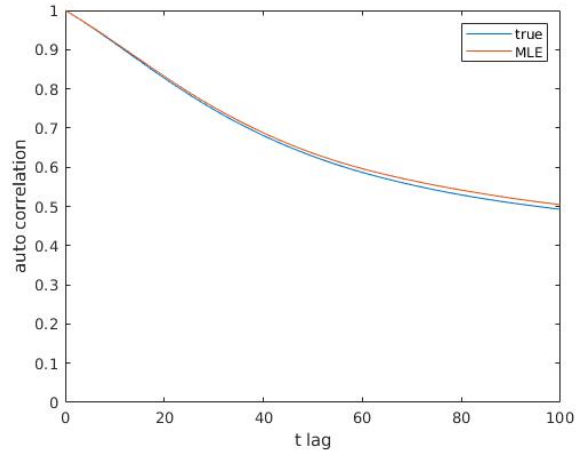
$$N = 10^5 = \frac{500}{0.005} = \frac{1000}{0.01} = \frac{5000}{0.05}.$$

	mean	variance	the 3rd moment	the 4th moment
Trend=500; dt=0.005; true	-0.0116	0.0070	0.0001	0.0001
Trend=500; dt=0.005, MLE	-0.0213	0.0071	0.0002	0.0002
Trend=1000;dt=0.01, true	0.0073	0.0067	0.0000	0.0001
Trend=1000;dt=0.01, MLE	-0.0058	0.0066	0.0000	0.0001
Trend=5000; dt=0.05,true	-0.0047	0.0066	-0.0000	0.0001
Trend=5000; dt=0.05,MLE	-0.0036	0.0054	-0.0000	0.0001

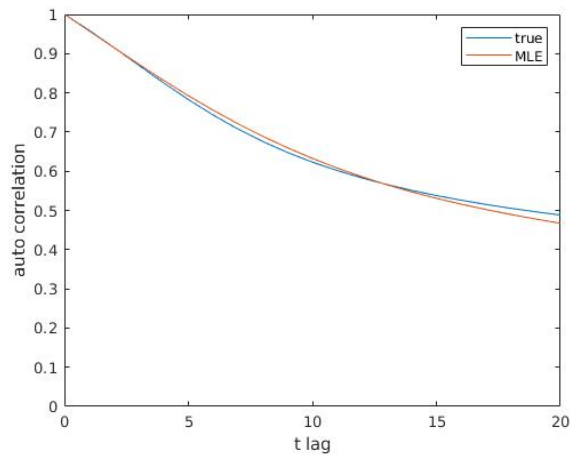
Table 2: statistics



(a) Trend= 500,dt=0.005

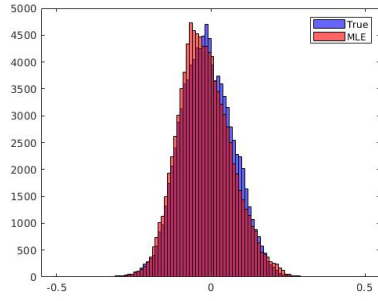


(b) Trend= 1000,dt=0.01

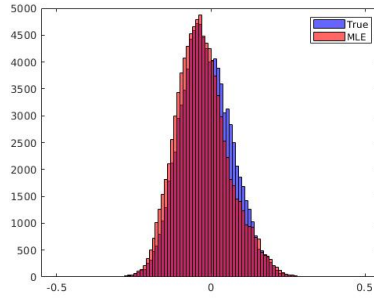


(c) Trend= 5000,dt=0.05

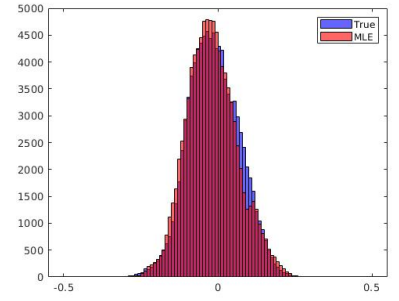
Figure 4: Same data size, different dt



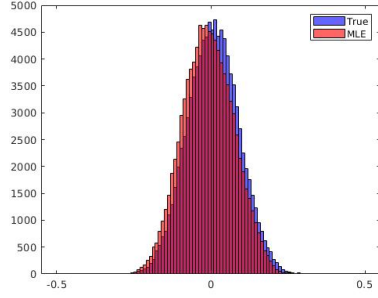
(a)  $x(1)$ , Trend= 500, dt=0.005



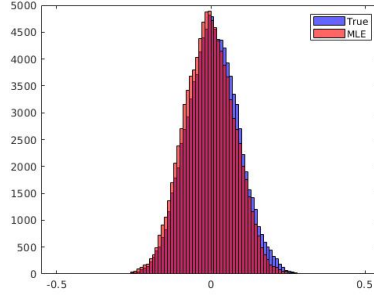
(b)  $x(8)$ , Trend= 500, dt=0.005



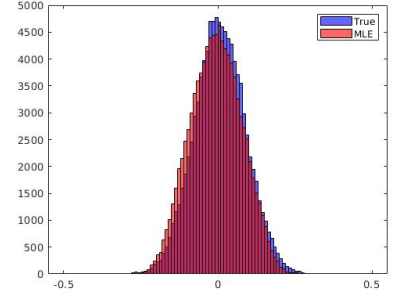
(c)  $x(16)$ , Trend= 500, dt=0.005



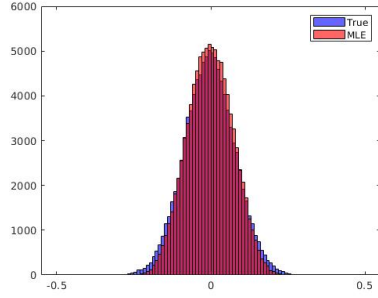
(d)  $x(1)$ , Trend= 1000, dt=0.01



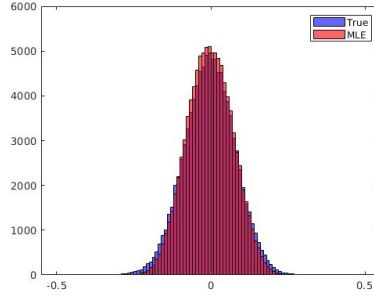
(e)  $x(8)$ , Trend= 1000, dt=0.01



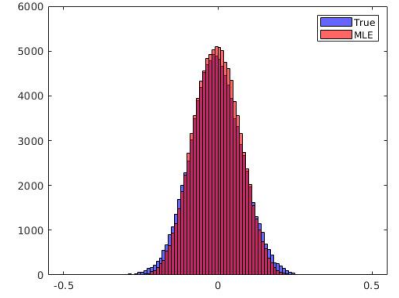
(f)  $x(16)$ , Trend= 1000, dt=0.01



(g)  $x(1)$ , Trend= 5000, dt=0.05

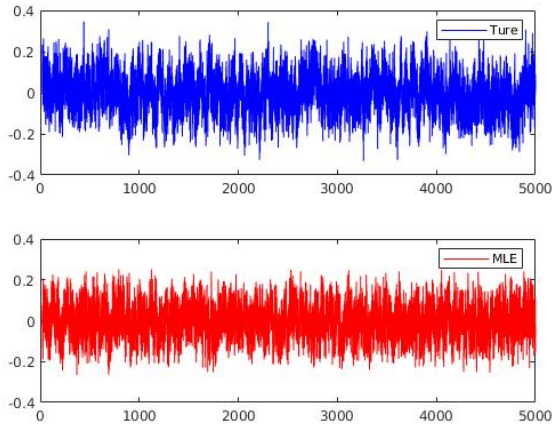


(h)  $x(8)$ , Trend= 5000, dt=0.05

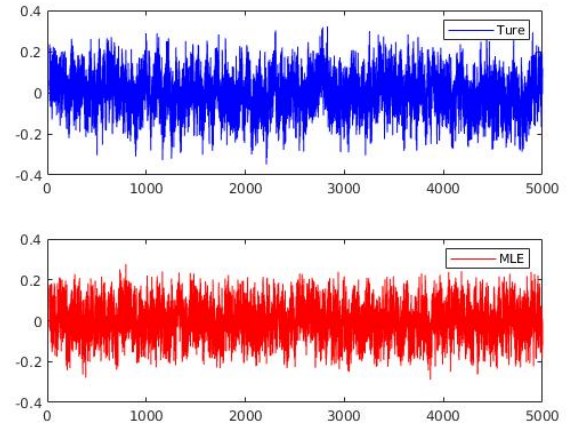


(i)  $x(16)$ , Trend= 5000, dt=0.05

Figure 5: histogram



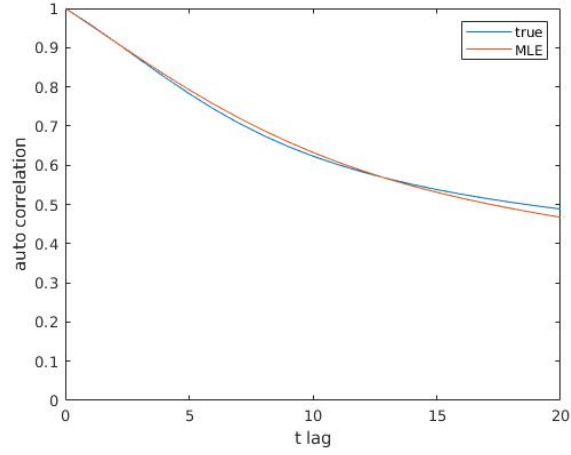
(a)  $x(1)$ , Trend= 5000, dt=0.05



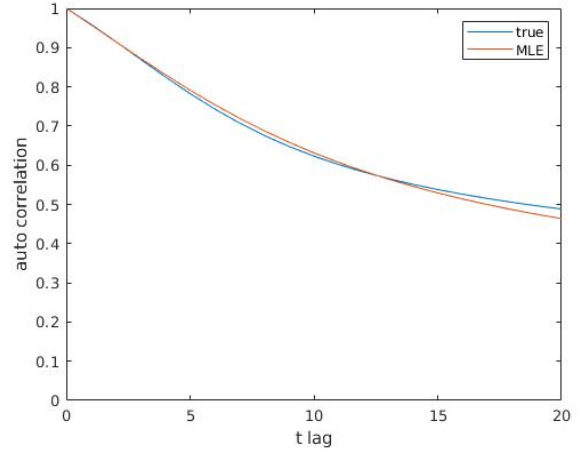
(b)  $x(8)$ , Trend= 5000, dt=0.05

Figure 6: some example of Trend=5000, dt=0.05

(4) for the case Trend=5000, dt=0.05, we print out the true parameter for data generation, the user-defined initial guess and the MLE result. Also to check the optimization is unique, try different initial guess, which is  $0.9 \times \text{true}$ , do the Maximum likelihood estimation again. we get very similar.



(a) Trend= 5000,dt=0.05,initial=user-defined guess



(b) Trend= 5000,dt=0.05, initial=0.9\*true

Figure 7: different initiation

The detail of parameters is attached.