

```

In[1]:= constantSignalValue = 0.3;
        (* from here we assume sample count of 1000 *)
        sampleCount = 1000;
        originalConstantSignal = constantSignalValue & /@Range[sampleCount];
        (* 1 bit quantization of constant signal of 1000 samples *)
        quantizedSignal = Round[constantSignalValue] & /@Range[sampleCount];
        SetDirectory@NotebookDirectory[];

```

```

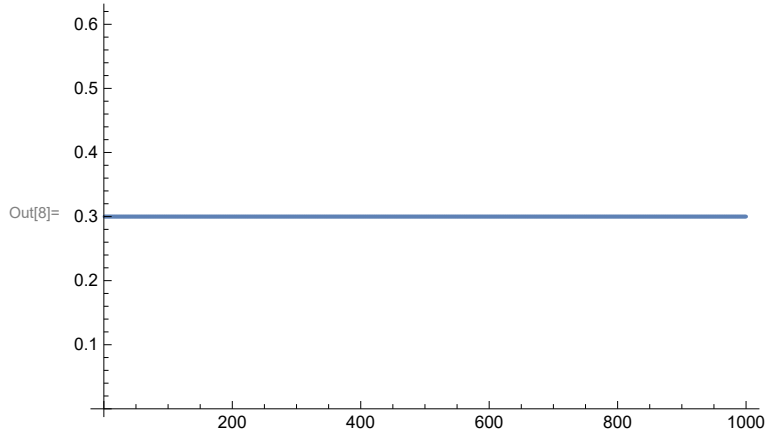
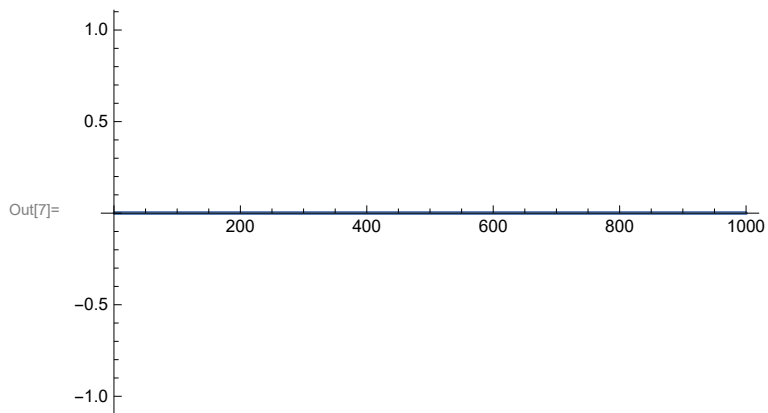
In[6]:= signalError = originalConstantSignal - quantizedSignal;

```

```

In[7]:= ListPlot[quantizedSignal]
        ListPlot[signalError]
        (* Plot of quantized signal *)

```



```

In[9]:= (* Plot of quantization error *)

```

```

In[10]:= (*As expected, average of signal error is 0.3 *)
         Mean[signalError]

```

Out[10]= 0.3

```

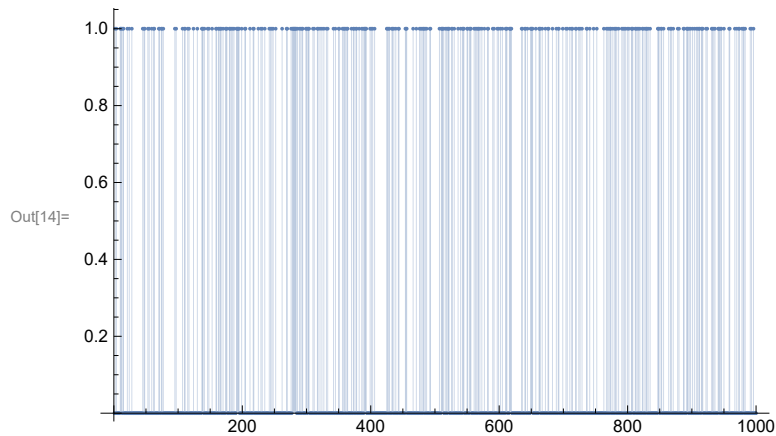
In[11]:= (* Same quantization, but with dithering in range -0.5, 0.5 *)

```

```
In[12]:= quantizedDitheredSignal =  
         Round[constantSignalValue + RandomReal[] - 0.5] & /@ Range[sampleCount];
```

```
In[13]:= (* Plot of quantized dithered signal *)
```

```
In[14]:= ListPlot[quantizedDitheredSignal, Filling -> Axis]
```



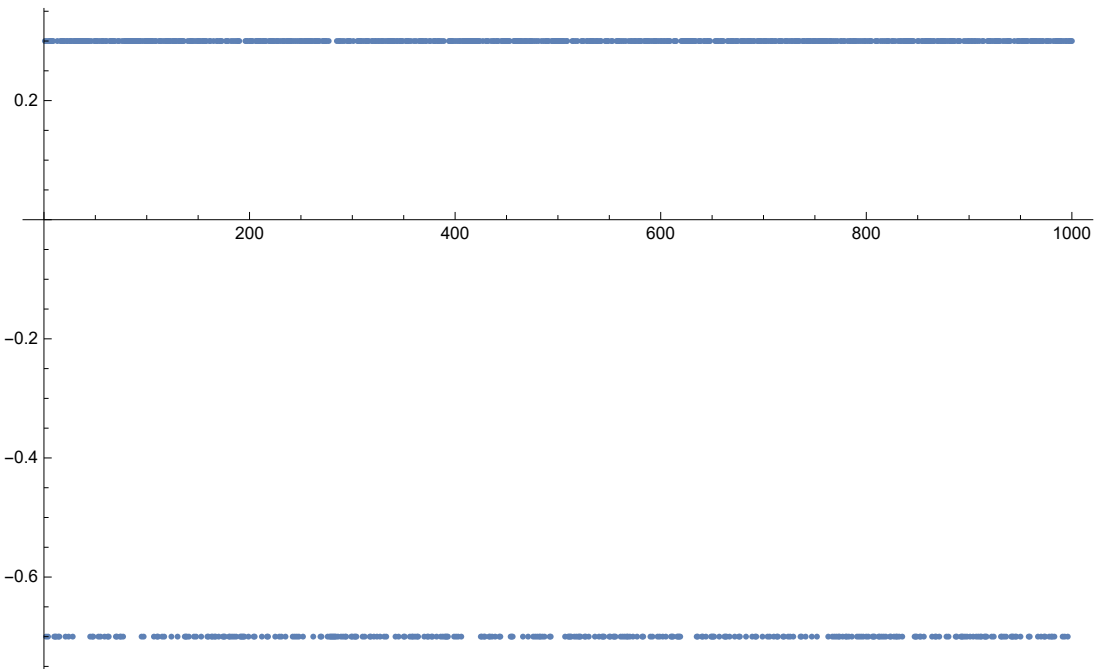
```
In[15]:=
```

```
Image[Join[{quantizedDitheredSignal}, {quantizedDitheredSignal},  
          {quantizedDitheredSignal}, {quantizedDitheredSignal}, {quantizedDitheredSignal},  
          {quantizedDitheredSignal}, {quantizedDitheredSignal}, {quantizedDitheredSignal},  
          {quantizedDitheredSignal}, {quantizedDitheredSignal}, {quantizedDitheredSignal},  
          {quantizedDitheredSignal}, {quantizedDitheredSignal}, {quantizedDitheredSignal},  
          {quantizedDitheredSignal}, {quantizedDitheredSignal}, 1]]
```

Out[15]=

```
In[16]:= (*Dithered signal error *)
```

```
In[17]:= ditheredSignalError = originalConstantSignal - quantizedDitheredSignal;
ListPlot[ditheredSignalError]
```



```
In[19]:= Mean[ditheredSignalError]
```

```
Out[19]= -0.022
```

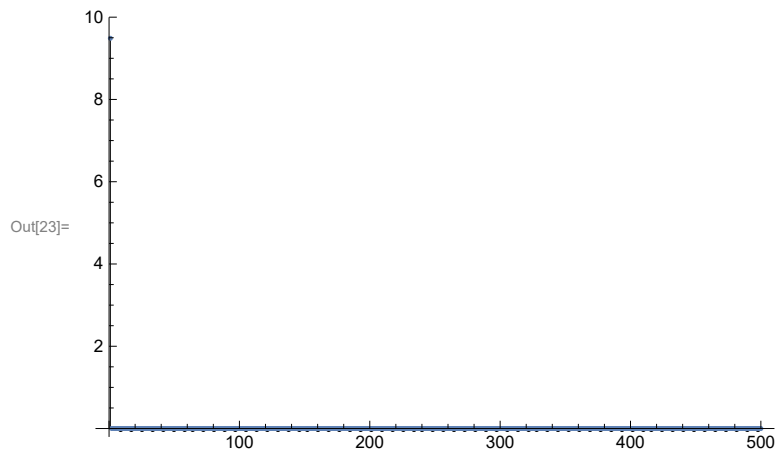
```
In[20]:= 0.028000000000000019
```

```
Out[20]= 0.028
```

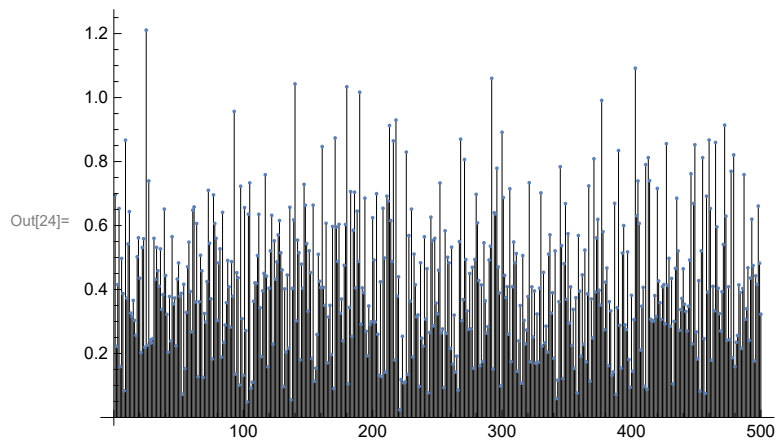
```
In[21]:= MyPeriodogram[x_, col_ : Black, range_ : Full] :=
  ListPlot[Abs@Fourier[x][[;; sampleCount/2]], PlotRange → range,
    Filling → Axis, FillingStyle → {Thickness[0.05], col}]
```

```
In[22]:= (*Frequency plot of error signal*)
```

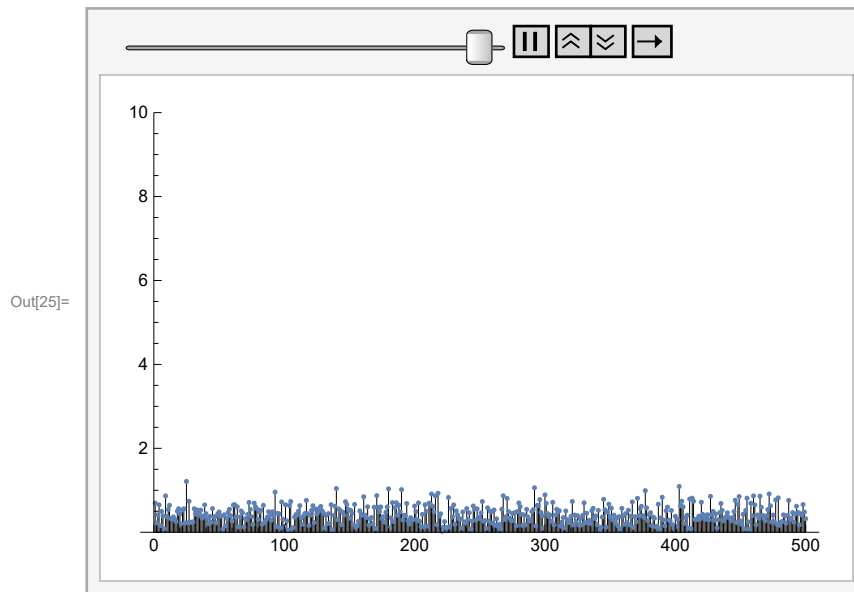
```
In[23]:= MyPeriodogram[signalError]
```



```
In[24]:= MyPeriodogram[ditheredSignalError]
```



```
In[25]:= ListAnimate[{MyPeriodogram[signalError, Red, {0, 10}],
  MyPeriodogram[ditheredSignalError, Black, {0, 10}]}]
```

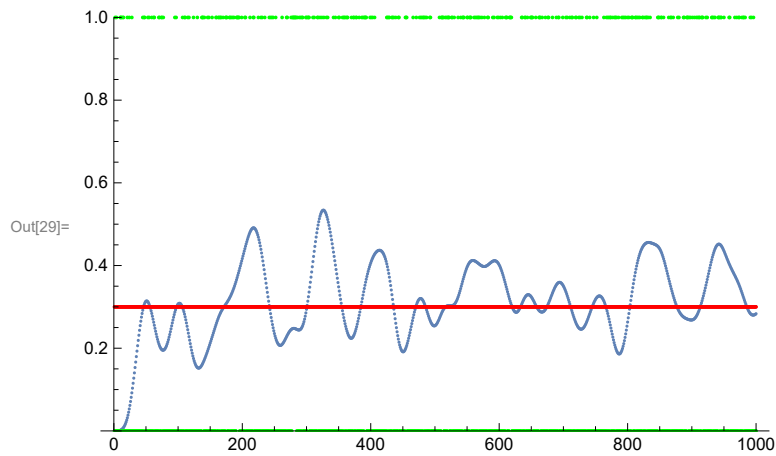


```
In[26]:= Export["spectrum_quantization_noise_comparison.gif",
  {MyPeriodogram[signalError, Red, {0, 10}],
   MyPeriodogram[ditheredSignalError, Black, {0, 10}]}, "DisplayDurations" -> 2];
```

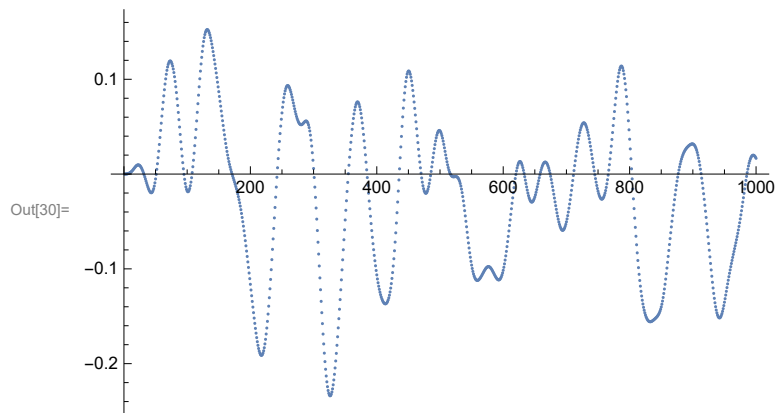
```
In[27]:= MyFilter[x_] := RecurrenceFilter[
  ToDiscreteTimeModel[ButterworthFilterModel[{5, 0.1}], 1], x, Padding -> "Fixed"]
```

```
In[28]:= (* Plot low pass filter applied on quantized signal and its error *)
```

```
In[29]:= Show[ListPlot[MyFilter[quantizedDitheredSignal], PlotRange -> {0, 1}],
  ListPlot[originalConstantSignal, PlotStyle -> Red],
  ListPlot[quantizedDitheredSignal, PlotStyle -> Green]]
```



```
In[30]:= ListPlot[MyFilter[ditheredSignalError]]
```



```
In[31]:= (*Let's try a different dithering noise function*)
```

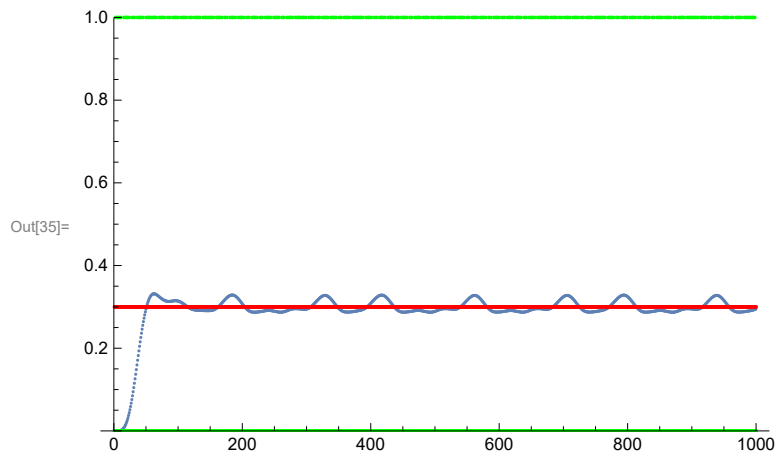
```
In[32]:= quantizedDitheredSignalGolden =
  Round[constantSignalValue + FractionalPart[GoldenRatio * #1] - 0.5] & /@
  Range[sampleCount];
```

```
In[33]:= ditheredSignalErrorGolden = originalConstantSignal - quantizedDitheredSignalGolden;
```

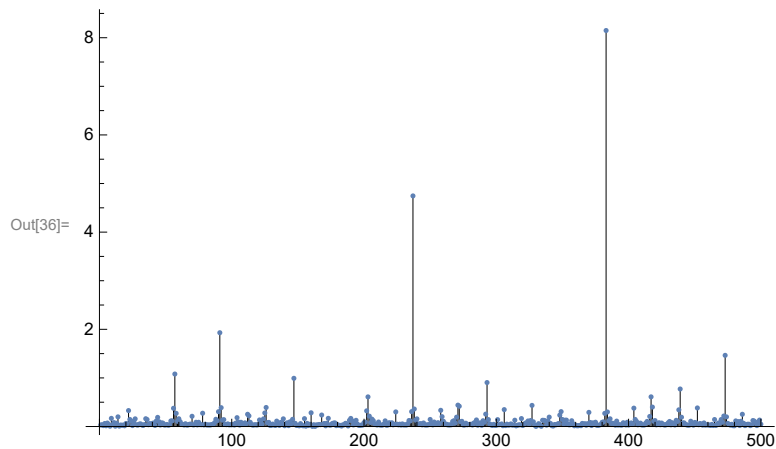
```
In[34]:= Mean[ditheredSignalErrorGolden]
```

Out[34]= -0.001

```
In[35]:= Show[ListPlot[MyFilter[quantizedDitheredSignalGolden], PlotRange -> {0, 1}],
  ListPlot[originalConstantSignal, PlotStyle -> Red],
  ListPlot[quantizedDitheredSignalGolden, PlotStyle -> Green]]
```



```
In[36]:= MyPeriodogram[ditheredSignalErrorGolden]
```



```
In[37]:= Image[Join[{quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden},
  {quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden},
  {quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden},
  {quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden},
  {quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden},
  {quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden},
  {quantizedDitheredSignalGolden}, {quantizedDitheredSignalGolden}, 1]]
```



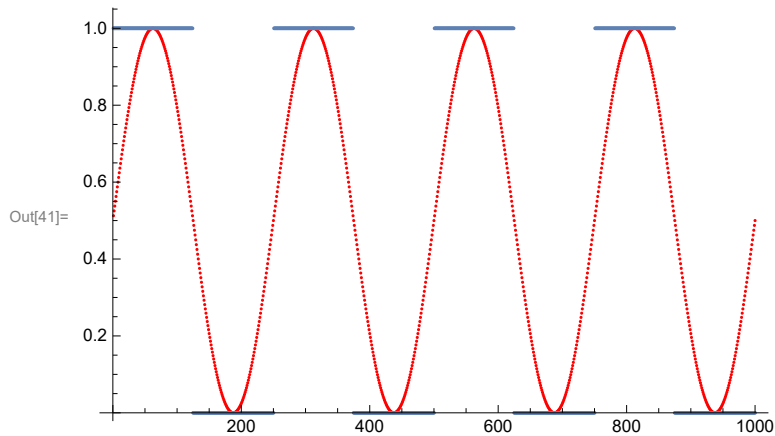
```
In[38]:= sineFunction[x_] := 0.5 + Sin[x/250 * 2 *  $\pi$ ] * 0.5;
```

```
originalSineSignal = sineFunction[#1] & /@ Range[sampleCount];
```

```
(* 1 bit quantization of sine signal*)
```

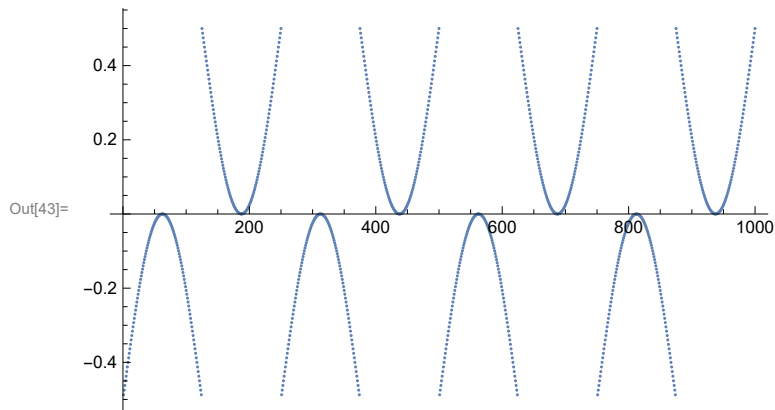
```
quantizedSineSignal = Round[sineFunction[#1]] & /@ Range[sampleCount];
```

```
In[41]:= Show[ListPlot[originalSineSignal, PlotStyle -> Red],  
ListPlot[quantizedSineSignal]]
```



```
In[42]:= sineSignalError = originalSineSignal - quantizedSineSignal;
```

```
In[43]:= ListPlot[sineSignalError]
```



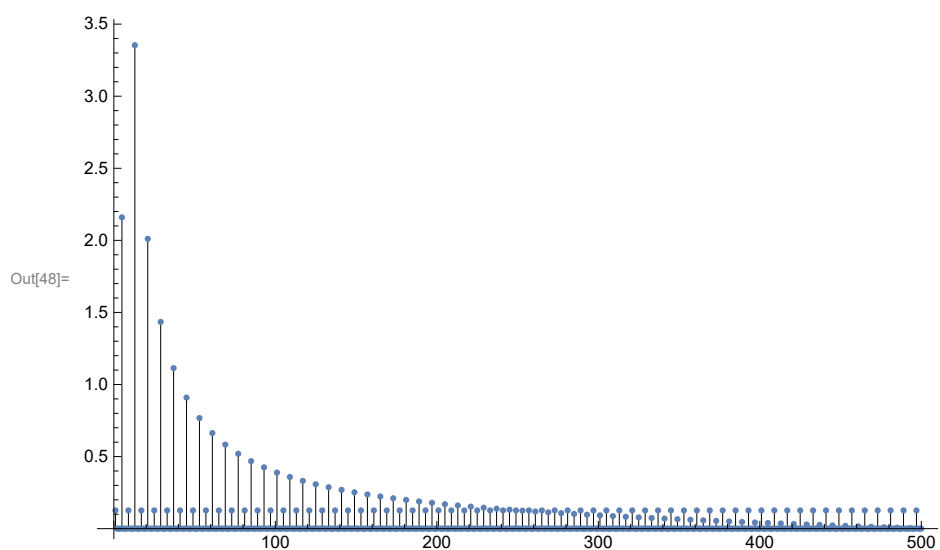
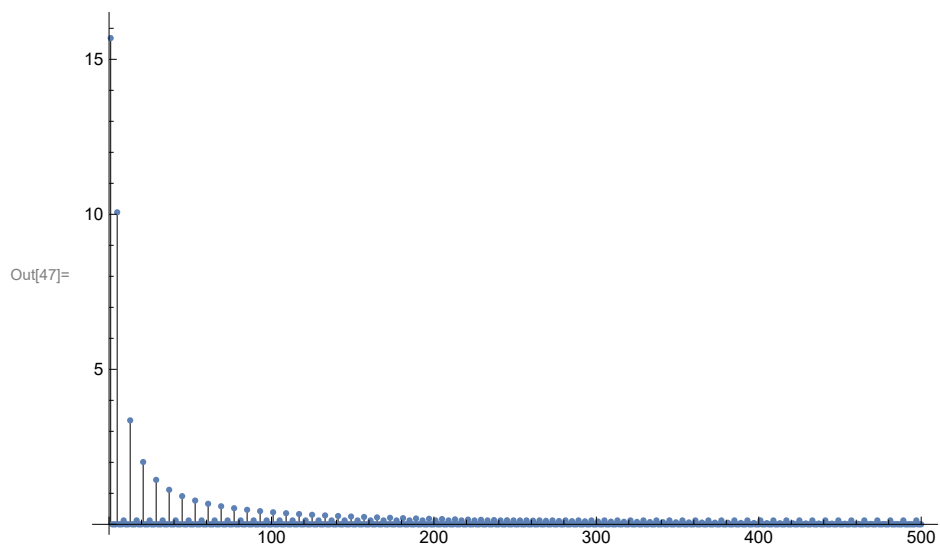
```
In[44]:= (*Average error... not bad, huh?*)
```

```
In[45]:= Mean[sineSignalError]
```

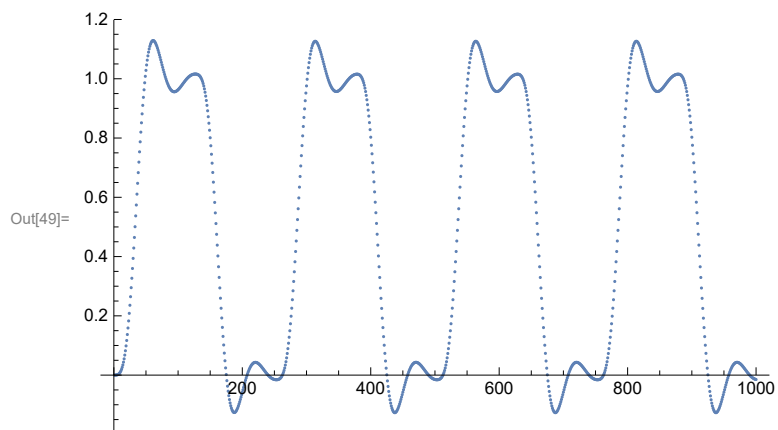
Out[45]= 0.004

```
In[46]:= (*But error has lots of low and high frequencies*)
```

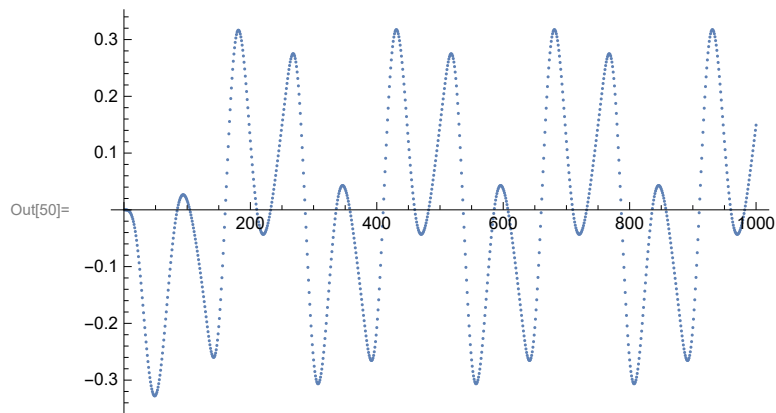
```
In[47]:= MyPeriodogram[quantizedSineSignal]  
MyPeriodogram[sineSignalError]
```



```
In[49]:= ListPlot[MyFilter[quantizedSineSignal]]
```




```
In[50]:= ListPlot[MyFilter[sineSignalError]]
```



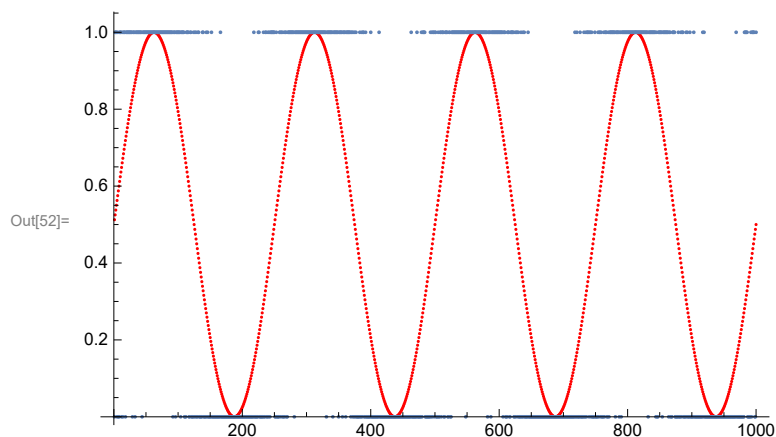
```
In[51]:= (* 1 bit quantization of dithered sine signal*)
```

```
quantizedDitheredSineSignal =
```

```
Round[sineFunction[#1] + RandomReal[] - 0.5] & /@Range[sampleCount];
```

```
In[52]:= Show[ListPlot[originalSineSignal, PlotStyle -> Red],
```

```
ListPlot[quantizedDitheredSineSignal]]
```



```
In[53]:= Image[Join[{quantizedDitheredSineSignal},
```

```
{quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
```

```
{quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
```

```
{quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
```

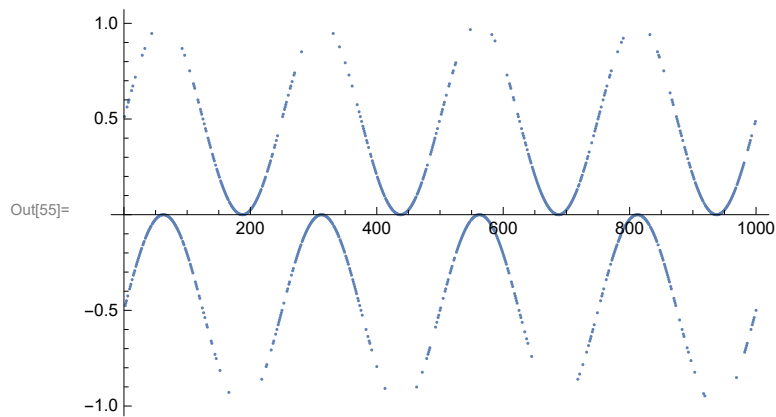
```
{quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
```

```
{quantizedDitheredSineSignal}, {quantizedDitheredSineSignal}, 1]]
```

```
ditheredSineSignalError = originalSineSignal - quantizedDitheredSineSignal;
```

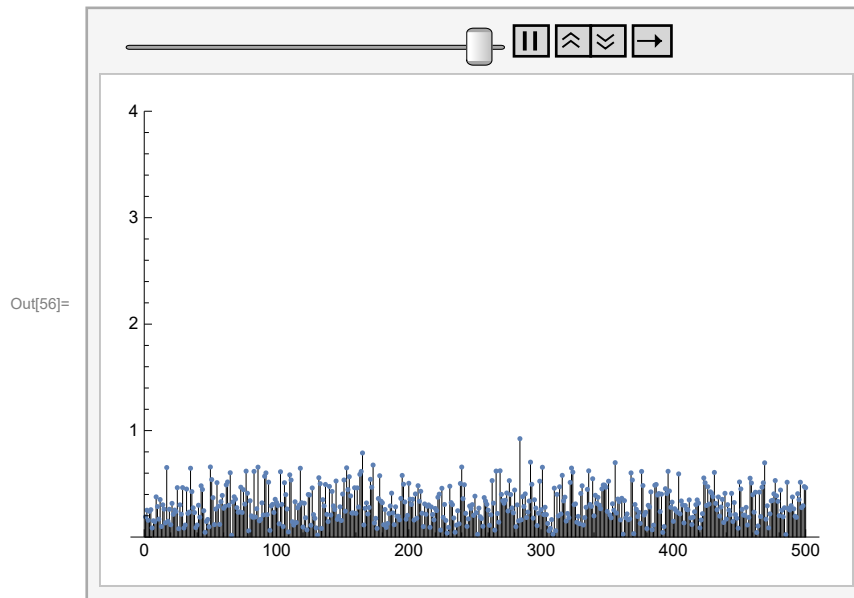
Out[53]=

In[55]:= **ListPlot[ditheredSineSignalError]**



In[56]:=

**ListAnimate[{MyPeriodogram[sineSignalError, Red, {0, 4}],
MyPeriodogram[ditheredSineSignalError, Black, {0, 4}]}]**

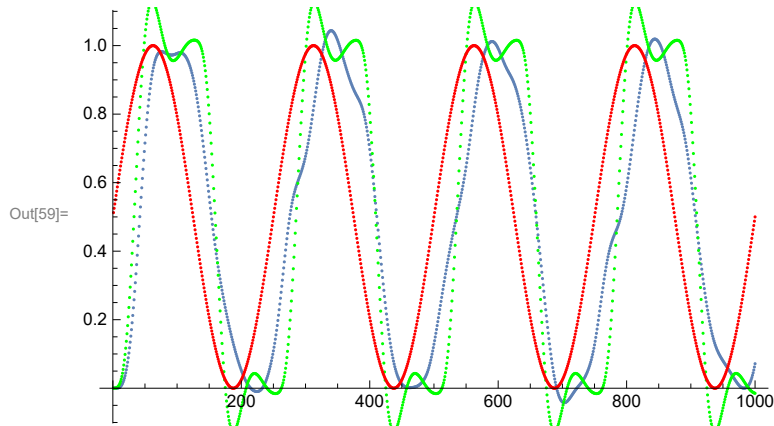


In[57]:= **Export["spectrum_quantization_noise_comparison_sine.gif",
{MyPeriodogram[sineSignalError, Red, {0, 4}],
MyPeriodogram[ditheredSineSignalError, Black, {0, 4}]}, "DisplayDurations" -> 2];**

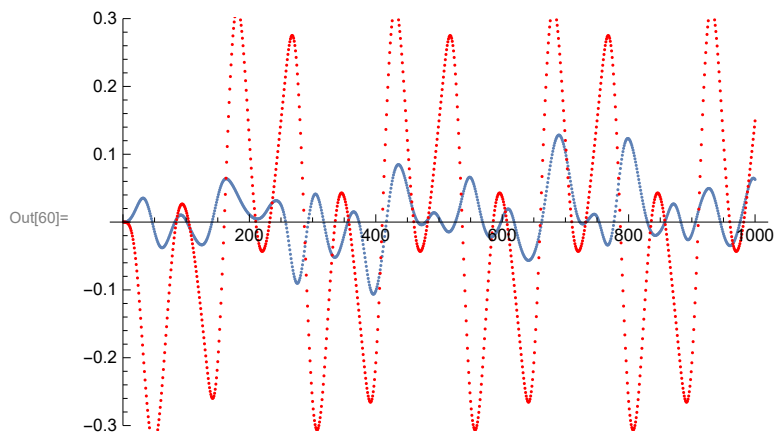
In[58]:= **Mean[ditheredSineSignalError]**

Out[58]= 0.006

```
In[59]:= Show[ListPlot[MyFilter[quantizedDitheredSineSignal]],
  ListPlot[MyFilter[quantizedSineSignal], PlotStyle -> Green],
  ListPlot[originalSineSignal, PlotStyle -> Red]]
```



```
In[60]:= Show[ListPlot[MyFilter[ditheredSineSignalError], PlotRange -> {-0.3, 0.3}],
  ListPlot[MyFilter[sineSignalError], PlotStyle -> Red]]
```



```
In[61]:= quantizedDitheredSineSignalGolden =
  Round[sineFunction[#1] + FractionalPart[GoldenRatio * #1] - 0.5] & /@
  Range[sampleCount];
Image[Join[{quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden}, 1]]
```

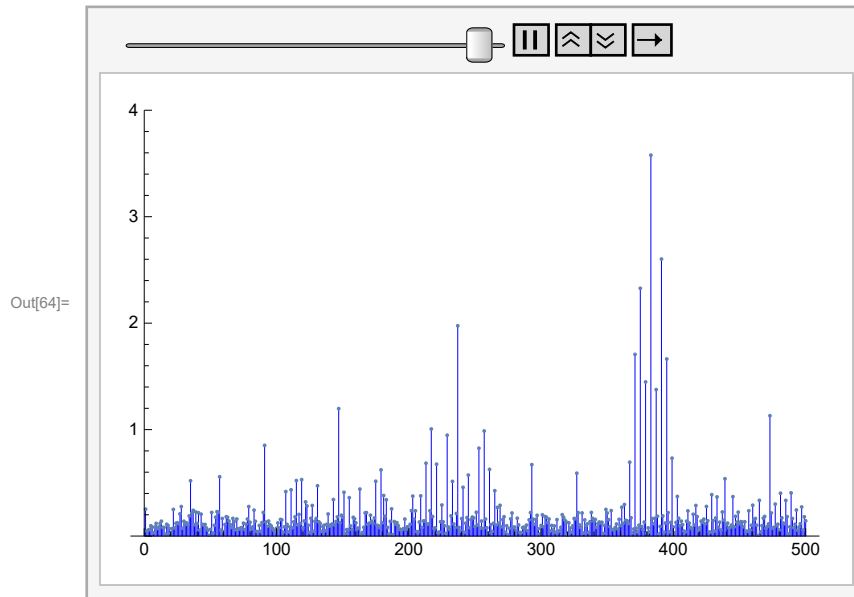
Out[62]=

```
In[63]:= ditheredSineSignalGoldenError =
  originalSineSignal - quantizedDitheredSineSignalGolden;
```

```

In[64]:= ListAnimate[{MyPeriodogram[sineSignalError, Red, {0, 4}],
  MyPeriodogram[ditheredSineSignalError, Black, {0, 4}],
  MyPeriodogram[ditheredSineSignalGoldenError, Blue, {0, 4}]}]
Export["spectrum_quantization_noise_golden__comparison_sine.gif",
  {MyPeriodogram[sineSignalError, Red, {0, 4}],
  MyPeriodogram[ditheredSineSignalError, Black, {0, 4}], MyPeriodogram[
    ditheredSineSignalGoldenError, Blue, {0, 4}]}], "DisplayDurations" -> 2];

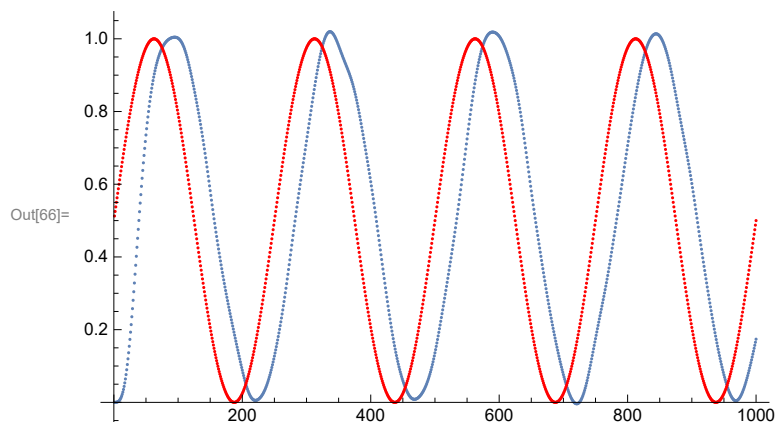
```



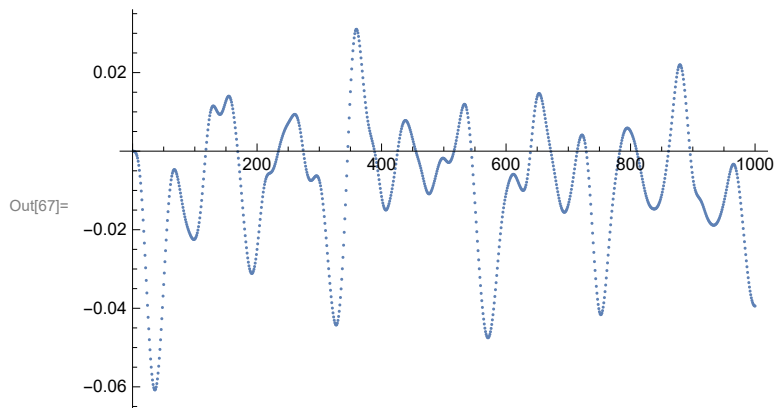
```

In[66]:= Show[ListPlot[MyFilter[quantizedDitheredSineSignalGolden]],
  ListPlot[originalSineSignal, PlotStyle -> Red]]

```



```
In[67]:= ListPlot[MyFilter[ditheredSineSignalGoldenError]]
```



```
In[68]:= Image[Join[{quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
  {quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
  {quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
  {quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
  {quantizedDitheredSineSignal}, {quantizedDitheredSineSignal},
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  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden},
  {quantizedDitheredSineSignalGolden}, {quantizedDitheredSineSignalGolden}, 1]]
```

