

A3a: Signals and Noise

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CSDS 464

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```
In [ ]: %load_ext autoreload
        %autoreload 2

import A3a_fxh157 as a3a
import math
import matplotlib.pyplot as plt
import numpy as np
import scipy
import IPython

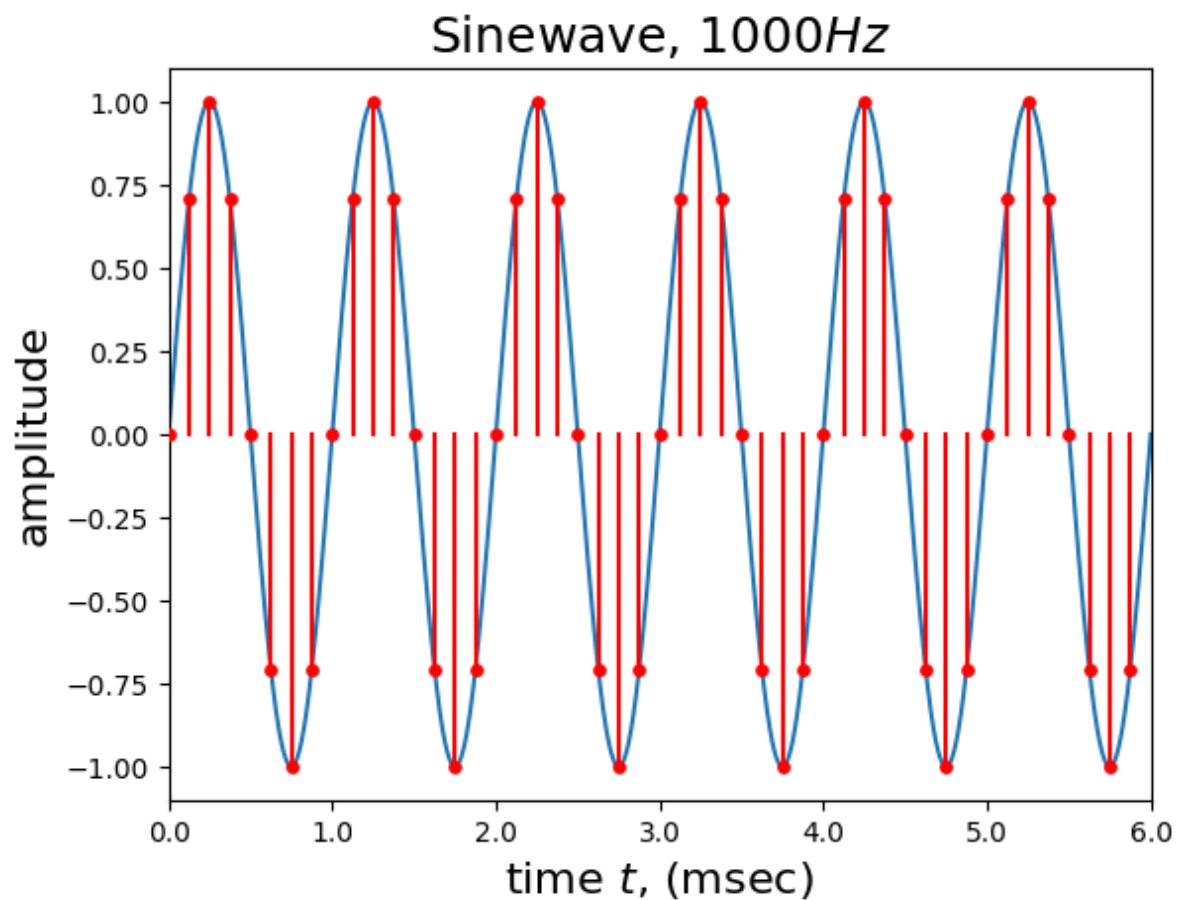
import sys
sys.path.append('../464-A1b_fxh157_files/')
import A1b_fxh157 as a1b
```

1. Continuous signals and sampling

1a. Sampled functions

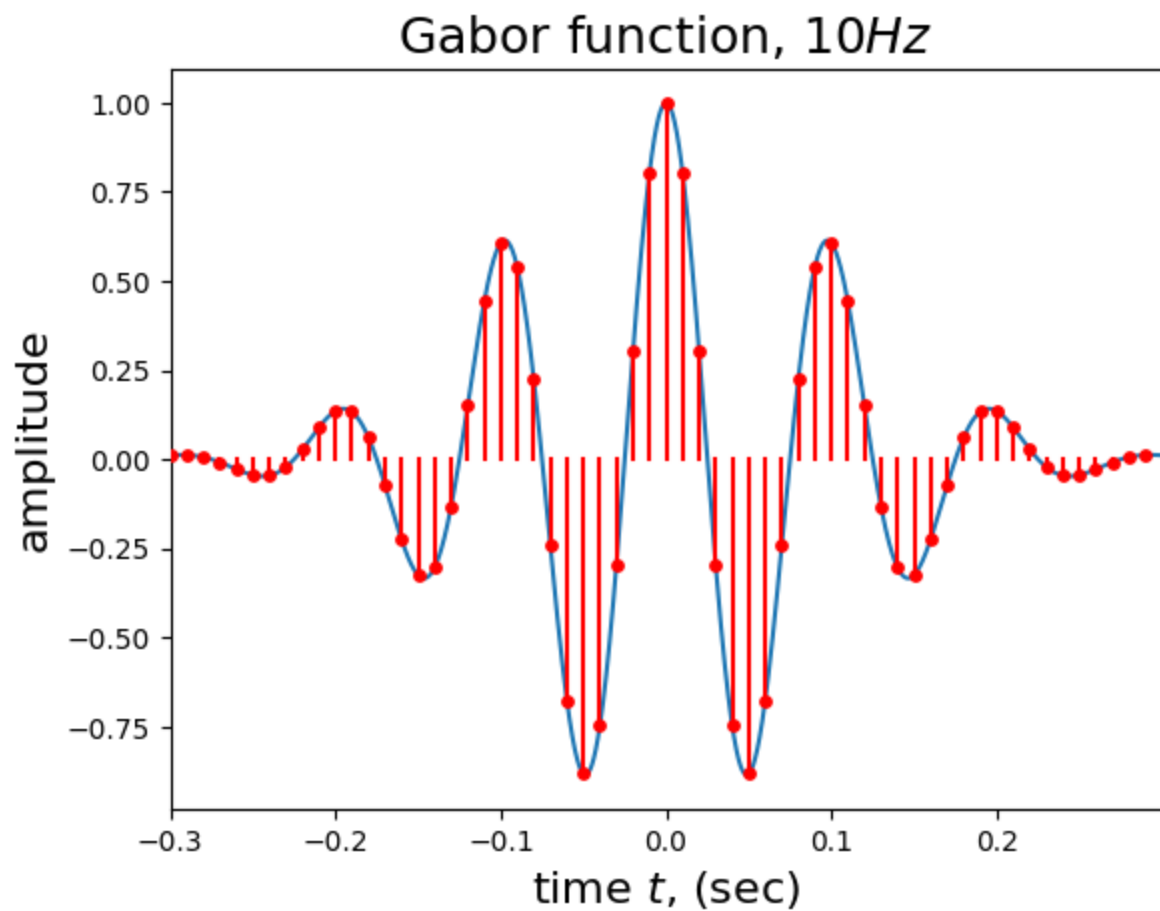
Example: Plot of a 1000Hz sinewave sampled at 8000Hz .

```
In [ ]: a3a.plot_sampled_function(g=a1b.sinewave, fs=8000, tlim=(0, 6), tscale=0.001, tunit
```



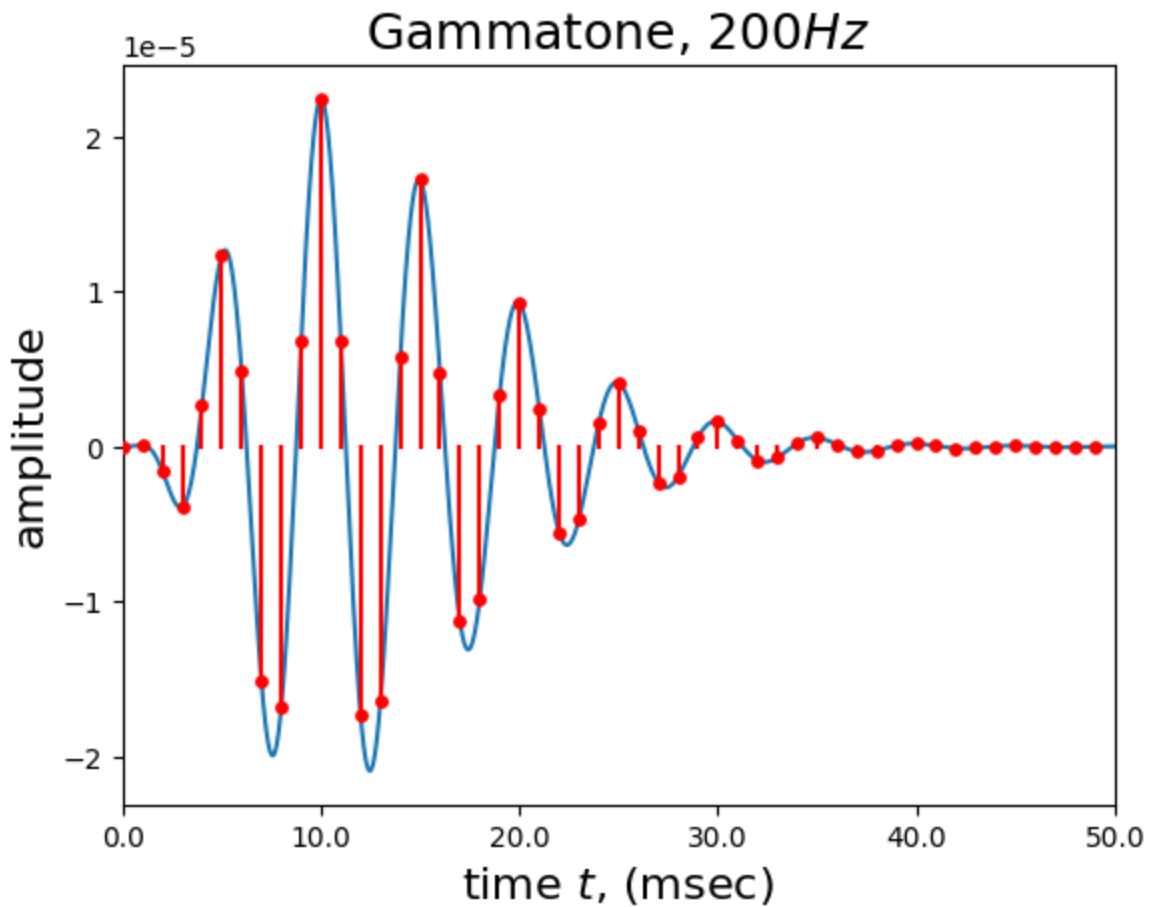
Example: Plot of a $10Hz$ gabor function sampled at $100Hz$.

```
In [ ]: a3a.plot_sampled_function(g=a1b.gabore, fs=100, tlim=(-0.3,0.3), tscale=1, tunits="
```



Example: Plot of a $200Hz$ gammatone sampled at $1000Hz$.

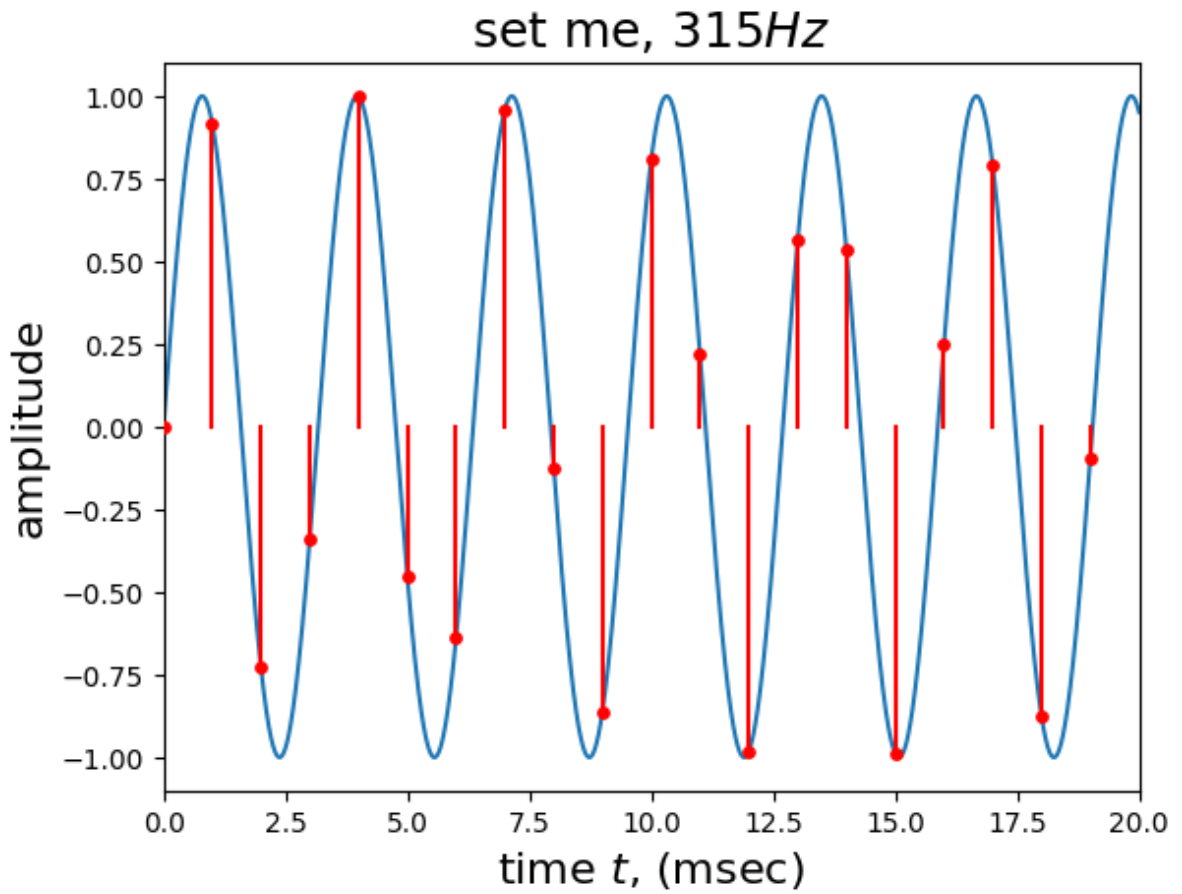
```
In [ ]: a3a.plot_sampled_function(g=a1b.gammatone, fs=1000, tlim=(0,50/1000), tscale=1, tun
```



1b. The Nyquist frequency and aliasing

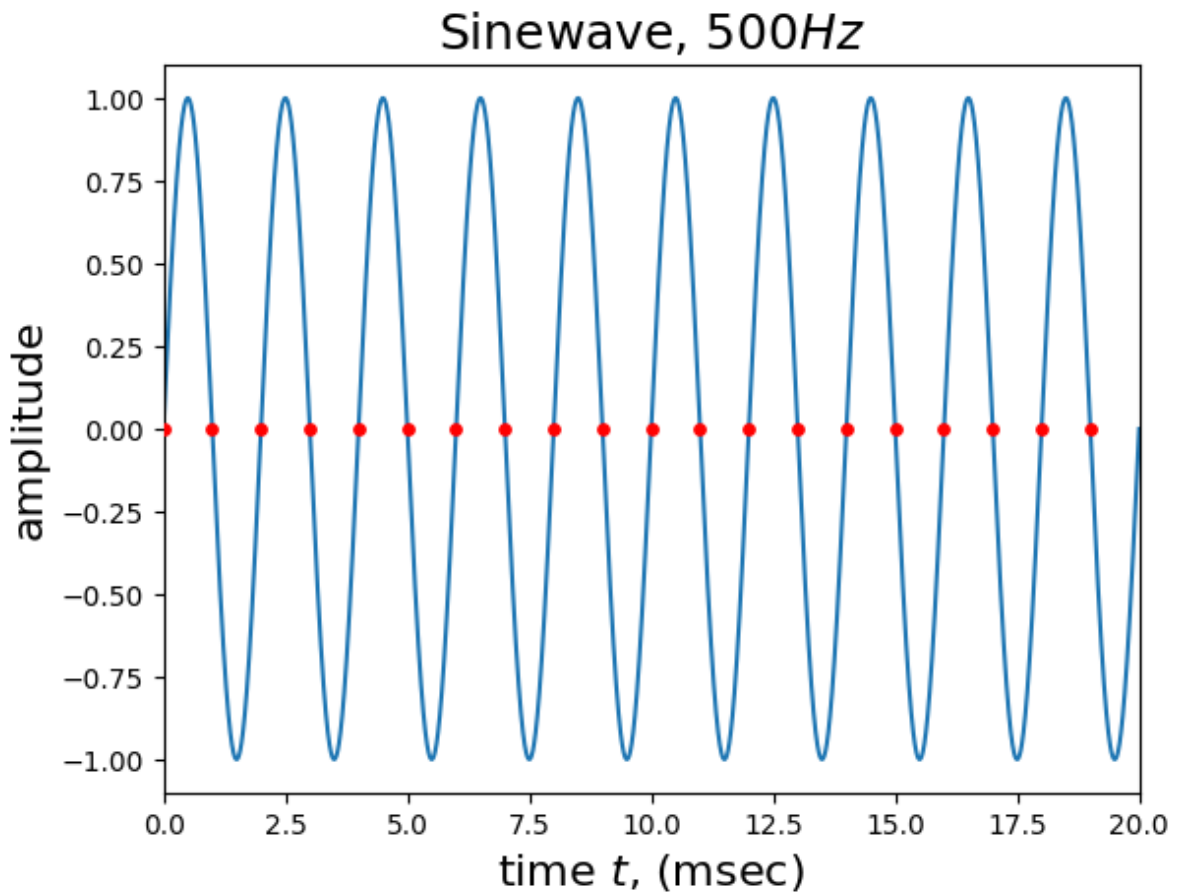
Example: Plot of a 315Hz sinewave sampled at 1000Hz . The sinewave below the Nyquist frequency shows samples per period that are unevenly distributed.

```
In [ ]: a3a.plot_sampled_function(g=a1b.sinewave, fs=1000, tlim=(0, 20), tscale=0.001, tuni
```



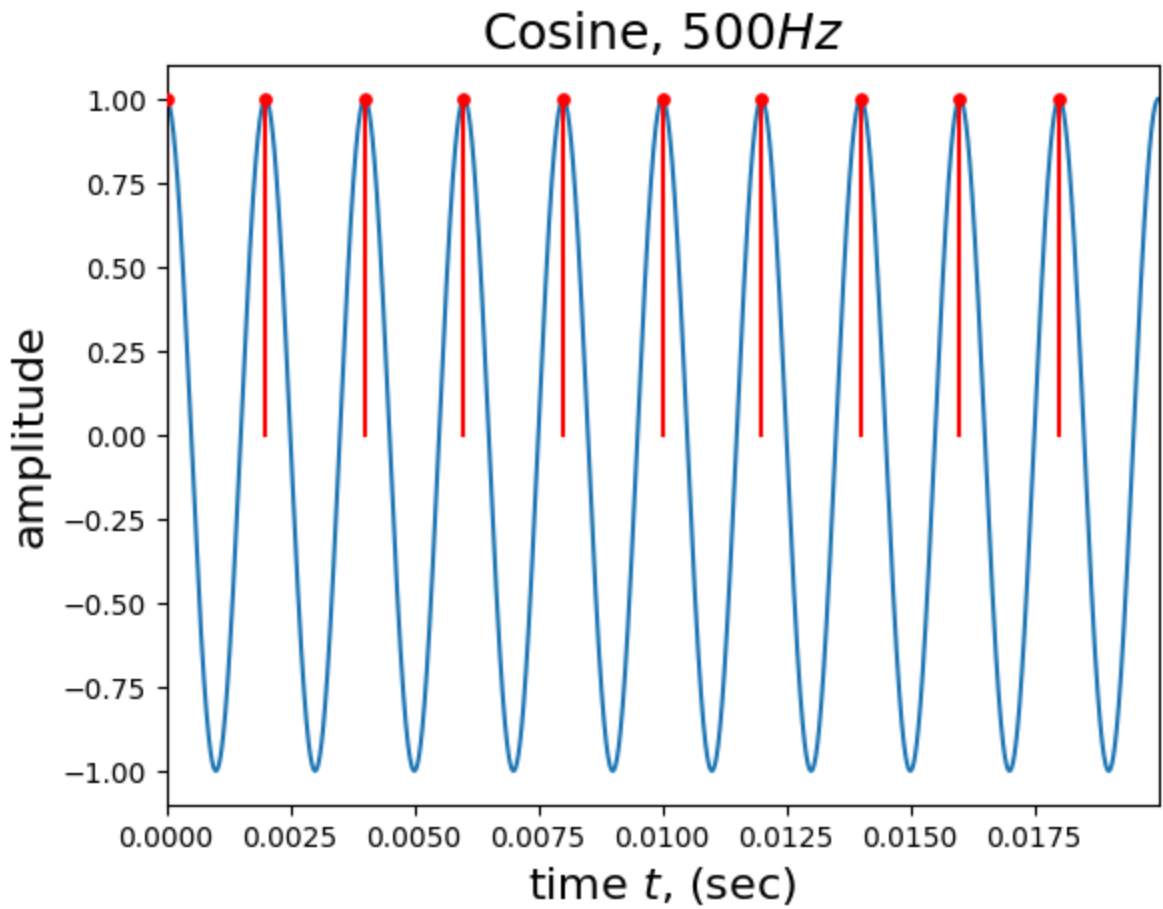
Example: Plot of a 500Hz sine wave sampled at 1000Hz . Sinewave at Nyquist.

```
In [ ]: a3a.plot_sampled_function(g=a1b.sinewave, fs=1000, tlim=(0, 20), tscale=0.001, titl
```



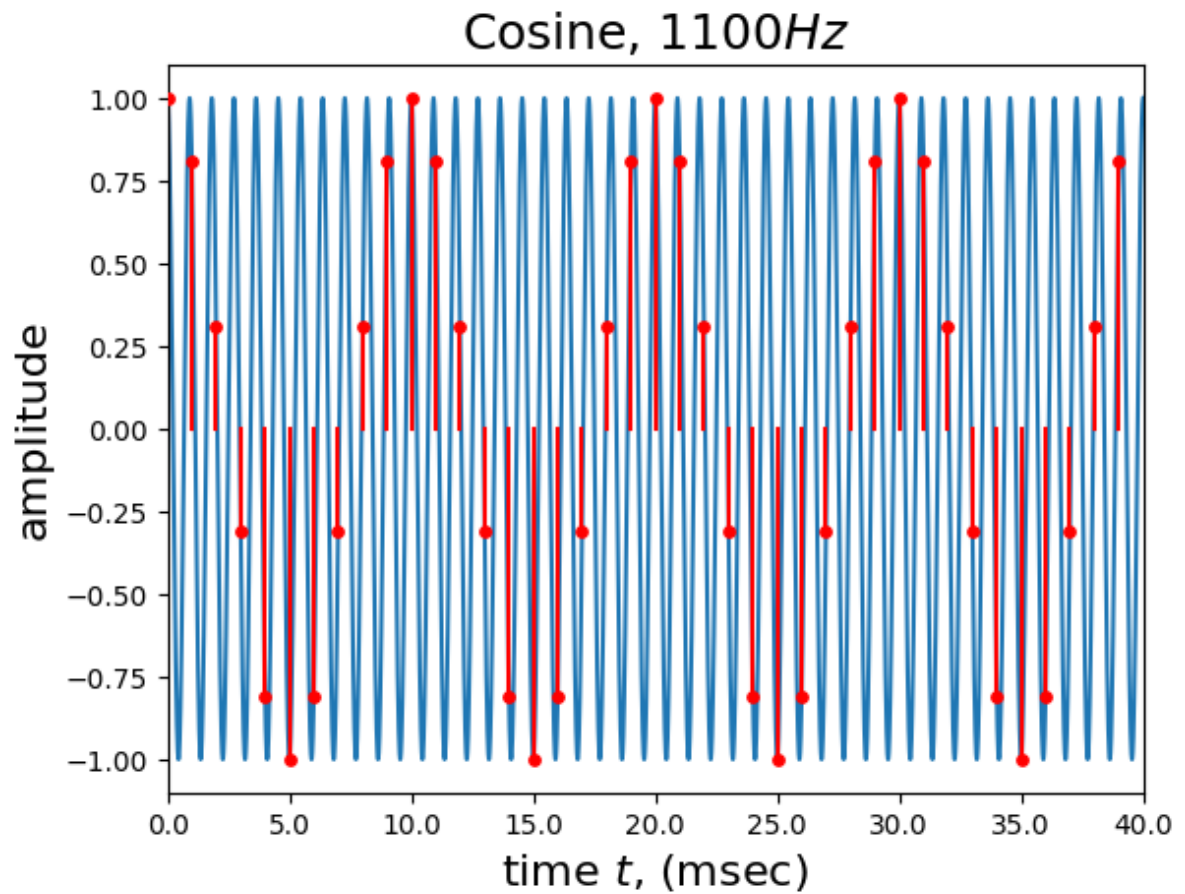
Example: Plot of a $1Hz$ cosine wave sampled at $1Hz$ with a duration of $7sec$. This demonstrates cosine at Nyquist.

```
In [ ]: a3a.plot_sampled_function(g=a1b.sinewave, fs=500, tlim=(0, 20), tscale=0.001, title
```



Example: Plot of a 1100Hz cosine wave sampled at 1000Hz . Cosine wave sampled above Nyquist to show aliasing.

```
In [ ]: a3a.plot_sampled_function(g=a1b.sinewave, fs=1000, tlim=(0, 40), tscale=0.001, tuni
```



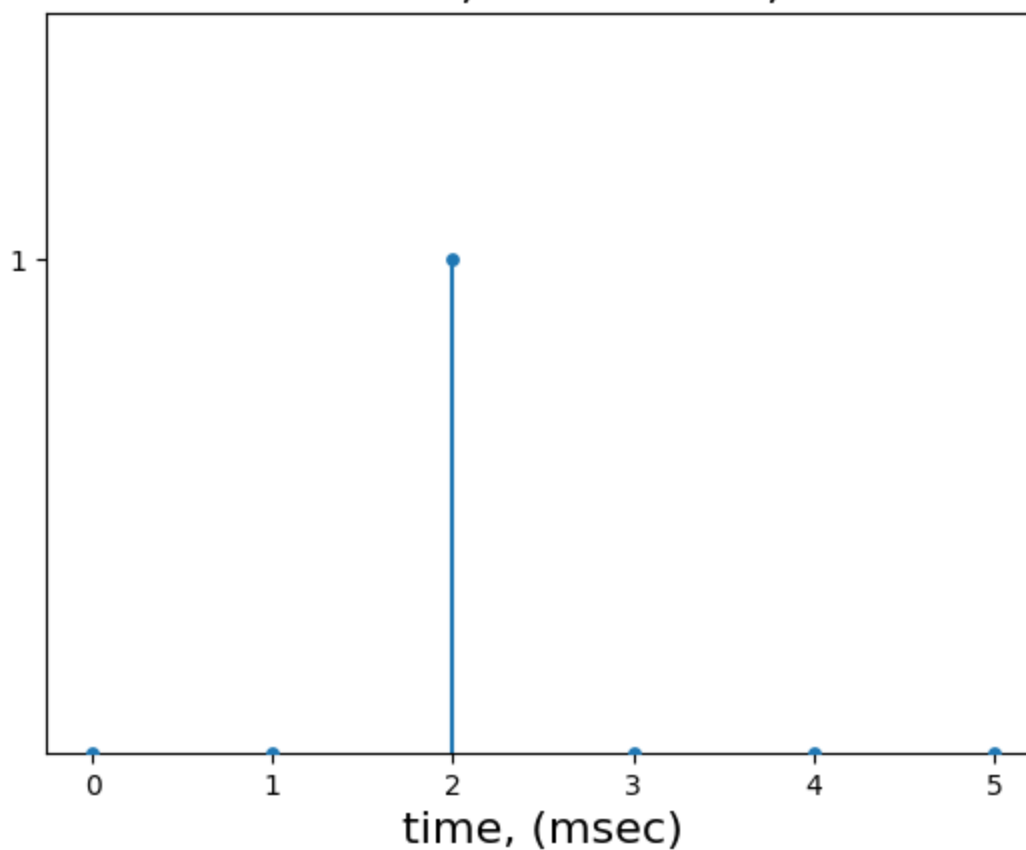
2. Signals

2a. Delta and step functions

Example: Plot of the Dirac delta function delayed by 2 seconds.

```
In [ ]: a3a.plot_delta_step(t0=0, tn=6, fs=1, g=a3a.d, tau=2, title="Dirac delta function",
```

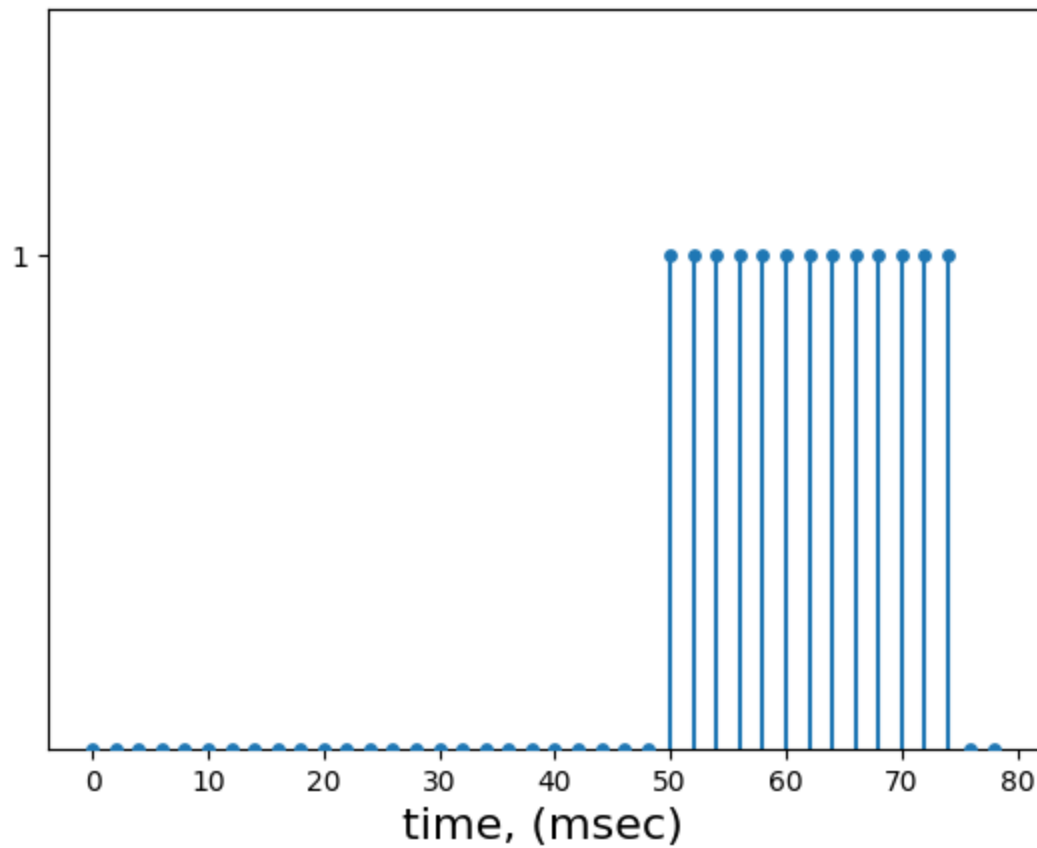

Dirac delta function, $\tau = 2 \text{ msec}$, $T = 0.0 \text{ msec}$



Example: Plot a step function starting at 50 ms that is 25 ms in duration and sampled at 500 Hz

```
In [ ]: a3a.plot_delta_step(t0=0, tn=80, fs=500, g=a3a.u, tau=50, T=25, tunits="msec", tsca
```

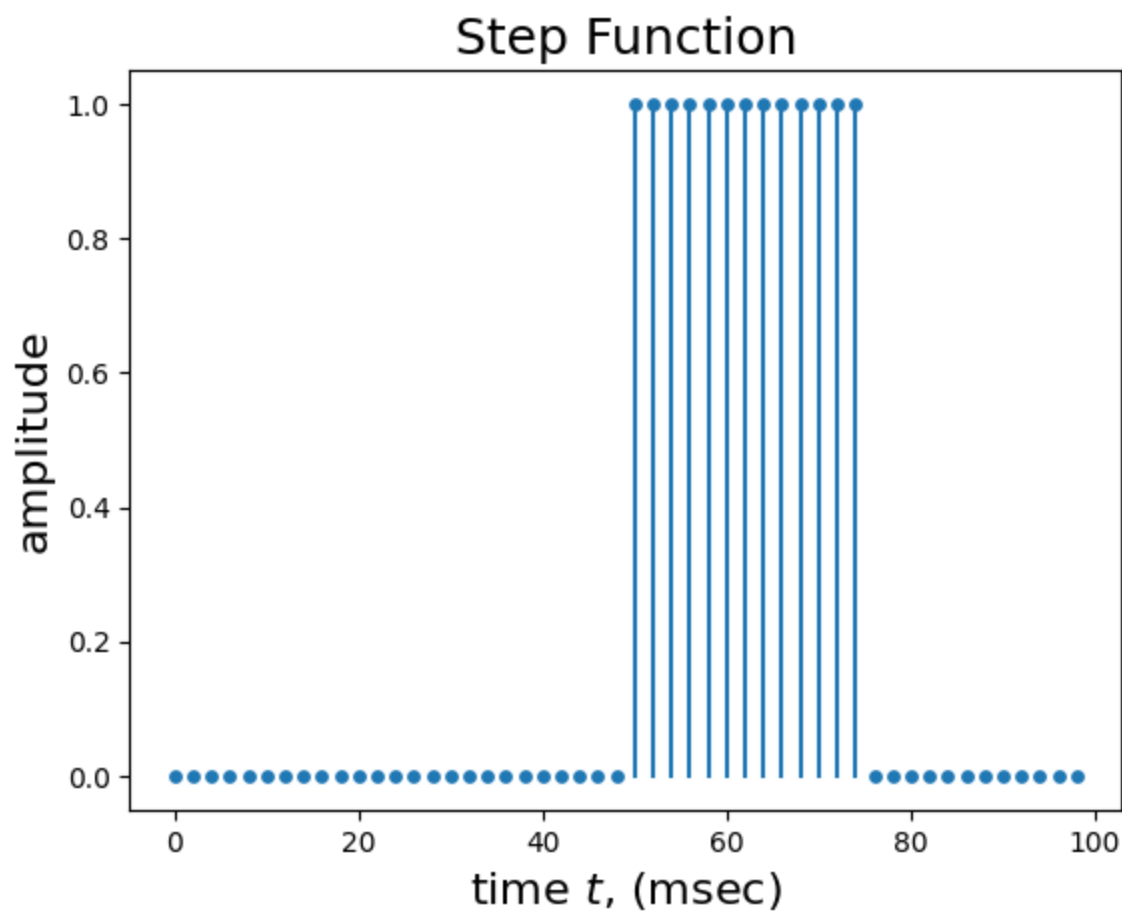
set me, $\tau = 50 \text{ msec}$, $T = 25 \text{ msec}$



2b. gensignal

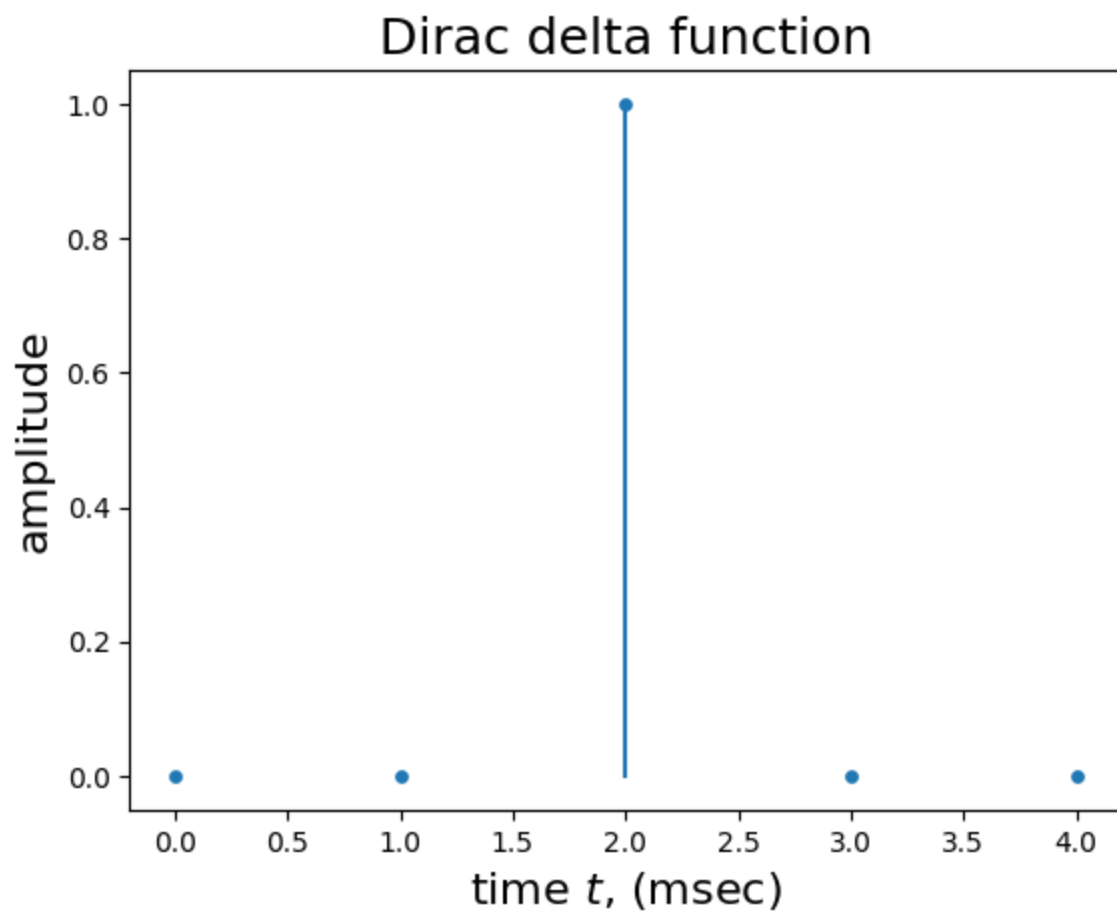
Example: Plot of a 100ms signal with a 50ms delayed step function that lasts for 25ms.

```
In [ ]: t0, y0 = a3a.gensignal(t0=0, tn=100, g=a3a.u, fs=0.5, tau=50, T=25, tscale=1)
a3a.plot_stem(t0, y0, title="Step Function", tunits="msec")
```



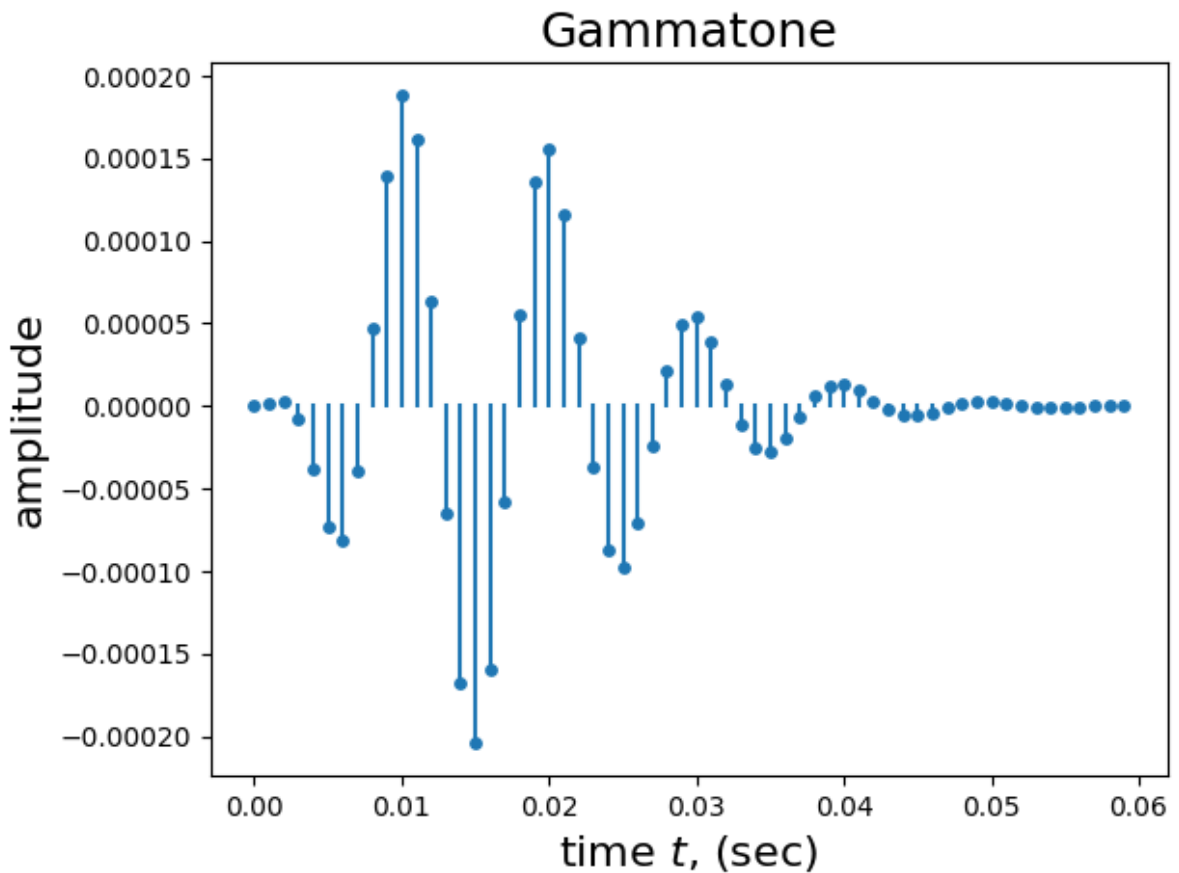
Example: Plot of a Dirac delta function delayed by 2sec.

```
In [ ]: t, y = a3a.gensignal(t0=0, tn=5, g=a3a.d, fs=1, tau=2, tscale=1)
a3a.plot_stem(t, y, title="Dirac delta function", tunits="msec")
```



Example: Plot of a gammatone function with frequency of $100Hz$, sampled at $1000Hz$.

```
In [ ]: t, y = a3a.gensignal(t0=0, tn=0.06, g=a1b.gammatone, fs=1000, tau=0, T=0.06, f=100)
a3a.plot_stem(t, y, title="Gammatone", tunits="sec")
```



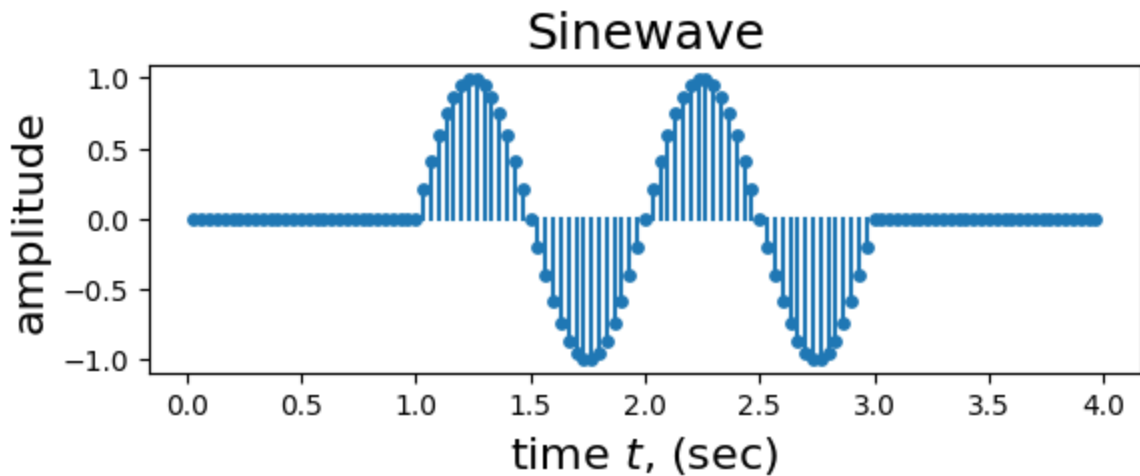
3. Noise and SNR

3a. energy , power , and snr

Example: Plot and computation of power and energy of a 1Hz sinewave.

```
In [ ]: t, y = a3a.gensignal(t0=0, tn=4, g=a1b.sinewave, fs=30, tau=1, T=2, tscale=1, f=1)
print(f"sinewave energy: {a3a.energy(y)}")
print(f"sinewave power: {a3a.power(y)}")
plt.figure().set_figheight(2)
a3a.plot_stem(t, y, title="Sinewave", tunits="sec")
```

```
sinewave energy: 30.0
sinewave power: 0.25210084033613445
```

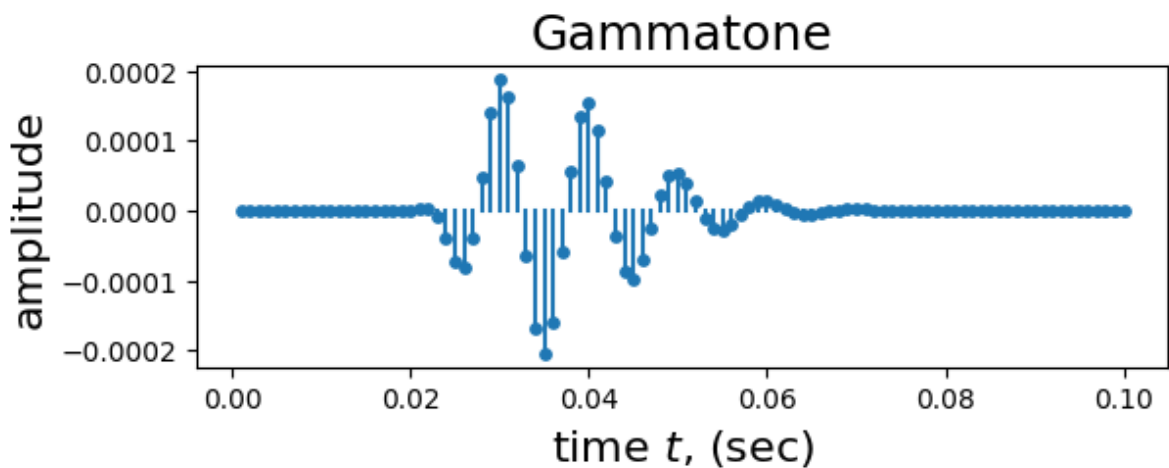


Example: Plot and computation of power and energy of a 100Hz gammatone.

```
In [ ]: t, y = a3a.gensignal(t0=0, tn=0.1, g=a1b.gammatone, fs=1000, tau=0.02, T=0.06, tsca
print(f"gammatone energy: {a3a.energy(y)}")
print(f"gammatone power: {a3a.power(y)}")
plt.figure().set_figheight(2)
a3a.plot_stem(t, y, title="Gammatone", tunits="sec")
```

gammatone energy: $2.9970499603720283\text{e-}07$

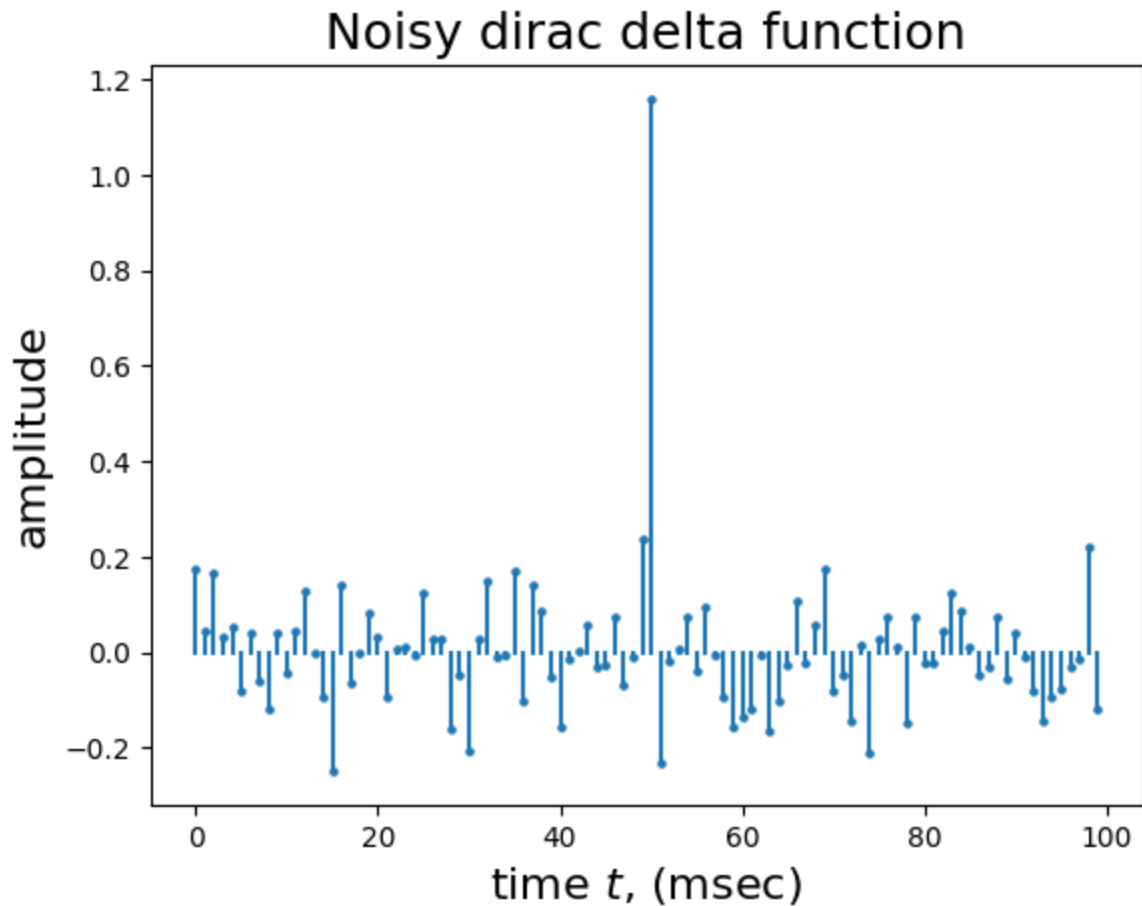
gammatone power: $2.997049960372028\text{e-}09$



3b. Noisy signals

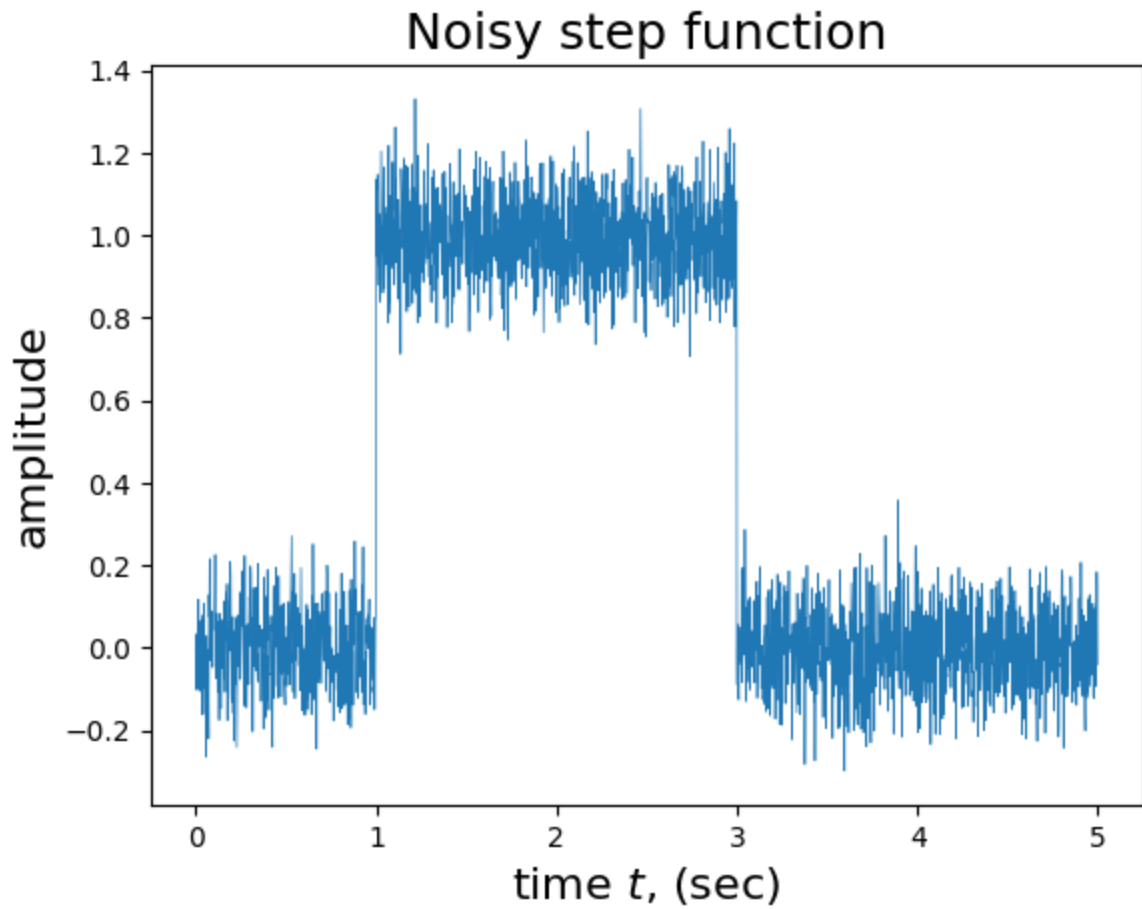
Example: Plot a 100ms waveform sampled at 1000Hz with a delta function delayed by 50ms with noise standard deviation of 0.1.

```
In [ ]: t, y, n = a3a.noisysignal(t0=0, tn=100, g=a3a.d, fs=1000, tau=50, T=0, s=0.1, tsca
a3a.plot_noisysignal(t=t, y=y+n, title="Noisy dirac delta function", tunits="msec",
```



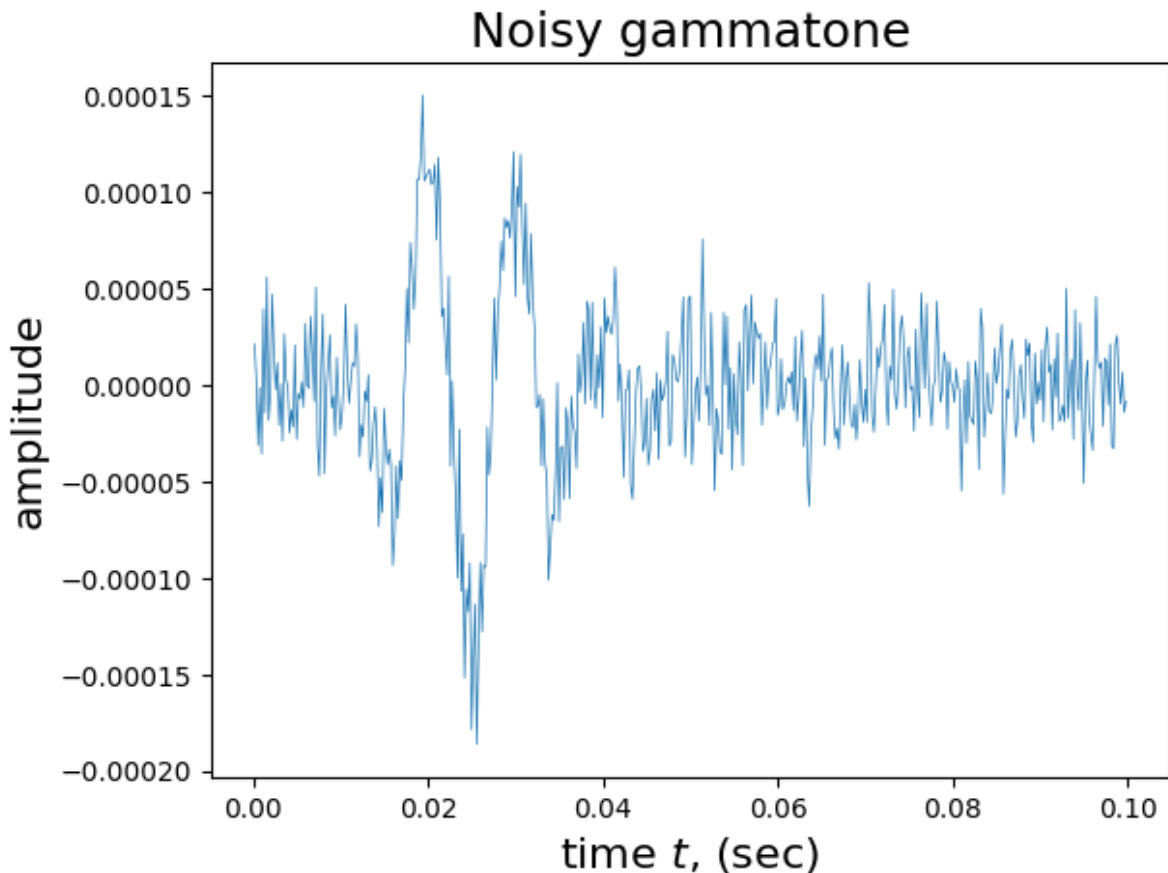
Example: Plot of a step function delayed by 1sec with a duration of 2sec in Gaussian noise with $\sigma = 0.1$.

```
In [ ]: t, y, n = a3a.noisysignal(t0=0, tn=5, g=a3a.u, fs=500, tau=1, T=2, s=0.1)
a3a.plot_noisysignal(t, y+n, "Noisy step function")
```



Example: Plot of noisy gammatone with frequency 100Hz delayed by 0.01sec , with a duration of 0.06sec in Gaussian noise of $\sigma = 0.000025$.

```
In [ ]: t, y, n = a3a.noisysignal(t0=0, tn=0.1, g=a1b.gammatone, fs=5000, tau=0.01, T=0.06,
a3a.plot_noisysignal(t, y+n, title="Noisy gammatone")
```

3c. Noise level specified by SNR

Calculating the signal power over the entire wave form leads to a biased result since it includes the regions of the waveform that are not expressing the signal. Therefore this would cause the computed signal power to be falsely low since the signals wave is being averaged over the entire waveform. The following examples show the computed sigma with and without knowledge of the signals location.

```
In [ ]: s = 0.2
sigma_known = sigma_unknown = 0
N = 100
fs = 100
tau = 4
T = 2

for _ in range(N):
    t, x, n = a3a.noisysignal(t0=0, tn=10, g=a1b.sinewave, fs=fs, tau=tau, T=T, s=s)

    Ps_known = a3a.power((x+n)[fs*tau:fs*(tau+T)])
    Ps_known = a3a.power(np.concatenate((n[:fs*tau], n[fs*(tau+T):])))
    SNR_known = a3a.snr(Ps_known, Ps_known)

    Ps_unknown = a3a.power(x+n)
    Pn_unknown = a3a.power(n)
    SNR_unknown = a3a.snr(Ps_unknown, Pn_unknown)
```

```

sigma_known += a3a.snr2sigma(x, snr=SNR_unknown)
sigma_unknown += a3a.snr2sigma(x, snr=SNR_known)

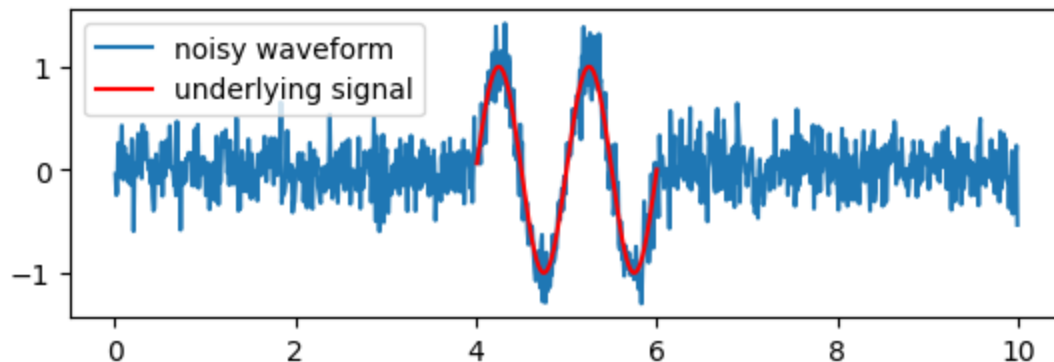
print(f"target sigma: {s}")
print(f"known signal location sigma: {round(sigma_known/N, 4)}")
print(f"unknown signal location sigma: {round(sigma_unknown/N, 4)}")
plt.figure().set_figheight(2)
plt.plot(t, x+n, label="noisy waveform")
plt.plot(t[400:600], x[400:600], 'r', label="underlying signal")
plt.legend()
plt.show()

```

target sigma: 0.2

known signal location sigma: 0.2119

unknown signal location sigma: 0.282



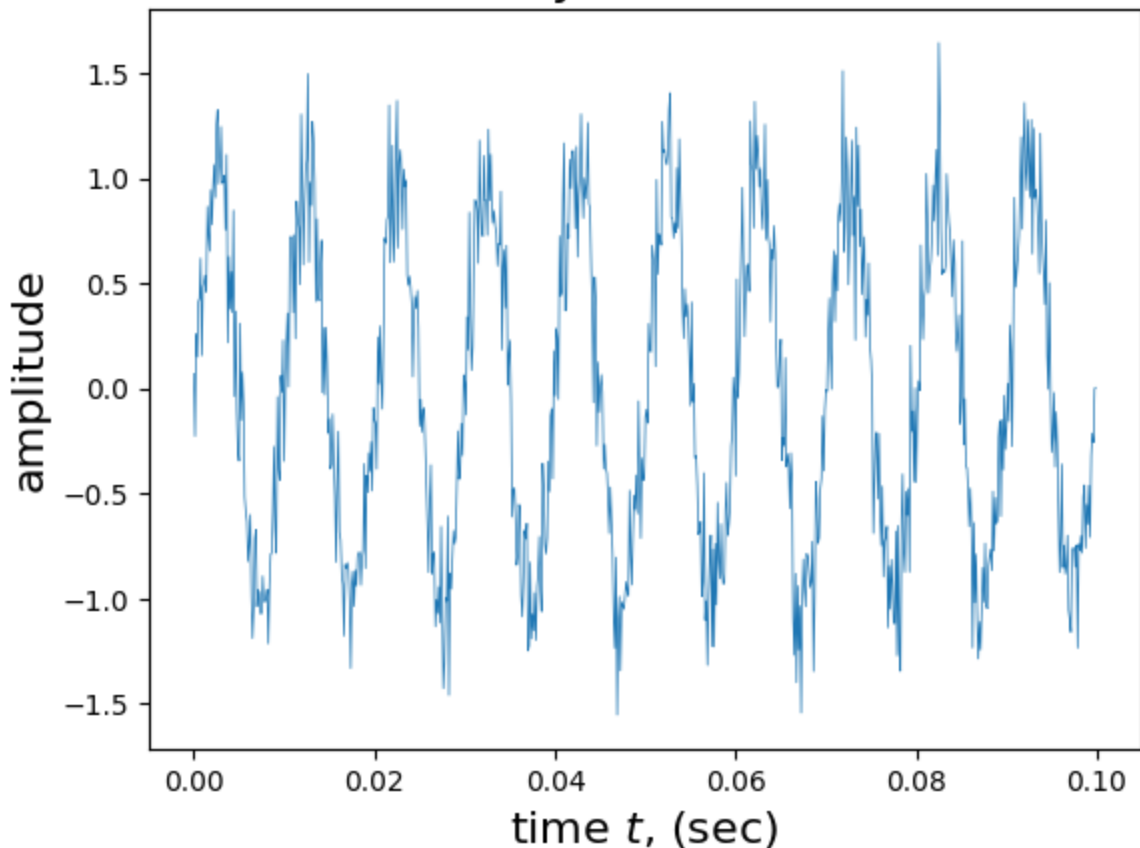
Example: Plot of a noisy sinewave with frequency 100Hz in 10dB of Gaussian noise with $\sigma = 0.1$.

```

In [ ]: _, y, _ = a3a.noisysignal(t0=0, tn=0.1, g=a1b.sinewave, fs=8000, tau=0, T=0.1, s=0,
s = a3a.snr2sigma(x=y, snr=10)
t, y, n = a3a.noisysignal(t0=0, tn=0.1, g=a1b.sinewave, fs=8000, tau=0, T=0.1, s=s,
a3a.plot_noisysignal(t=t, y=y+n, title="Noisy sinusodial", tunits="sec", plot_type=

```

Noisy sinusoidal



3d. Estimating SNR

Example: Estimate the SNR of a noisy 1Hz sinewave of length 5sec .

```
In [ ]: fs = 1000
tau = 1
T = 5
t, y, n = a3a.noisysignal(t0=0, tn=7, g=a1b.sinewave, fs=fs, tau=tau, T=T, s=0.1)
signal = y+n

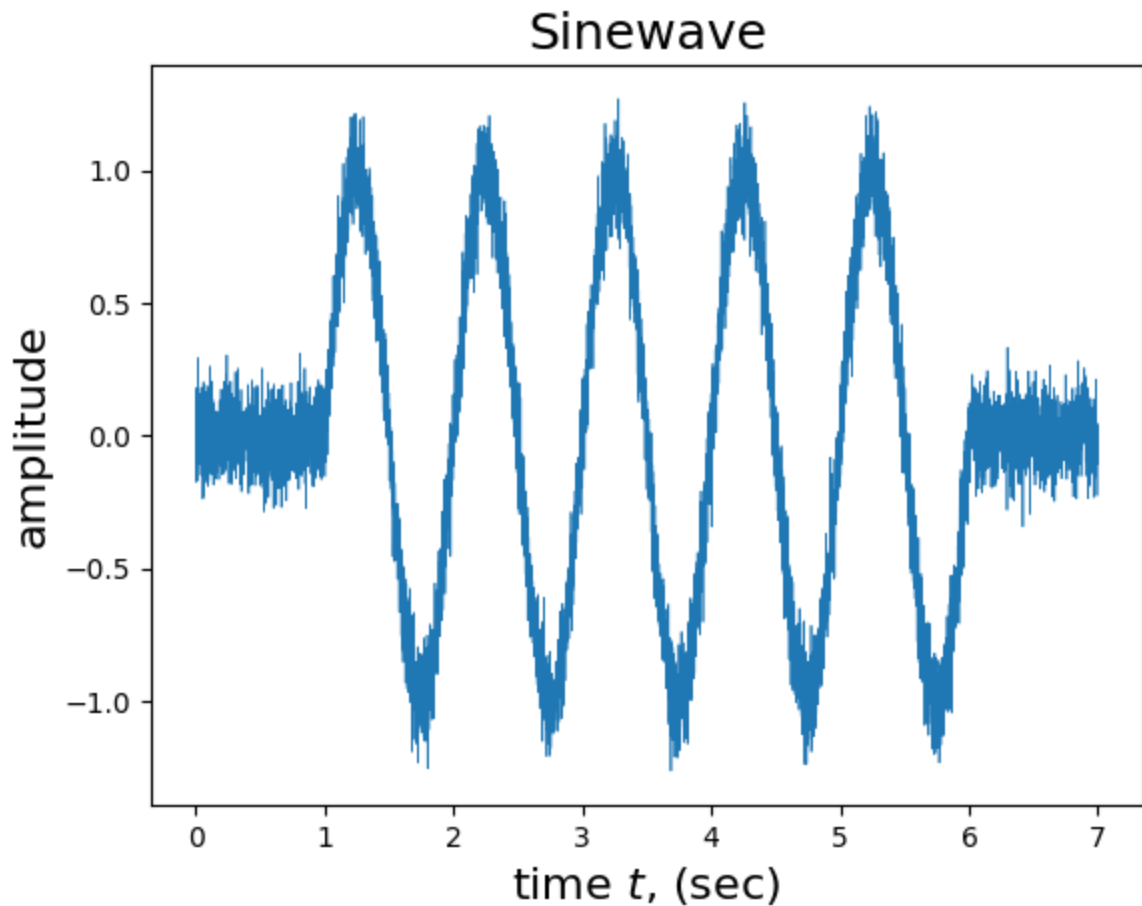
Ps = a3a.power(y)
Pn = a3a.power(n)
print(f"signal start index: {fs*tau}/{len(signal)}")
print(f"signal end index: {fs*(tau+T)}/{len(signal)}")
print(f"snr: {round(10*math.log10(a3a.snr(Ps, Pn)), 3)}dB\n")

th = max(signal)*(4*s)
start, stop = a3a.extent(y=signal, th=th)
Ps = a3a.power(signal[start:stop])
Pn = a3a.power(np.concatenate((signal[:start], signal[stop:])))
print(f"estimated start index: {start}/{len(signal)}")
print(f"estimated end index: {stop}/{len(signal)}")
print(f"estimated snr: {round(10*math.log10(a3a.snr(Ps, Pn)), 3)}dB")

a3a.plot_noisysignal(t, signal, title="Sinewave")
```

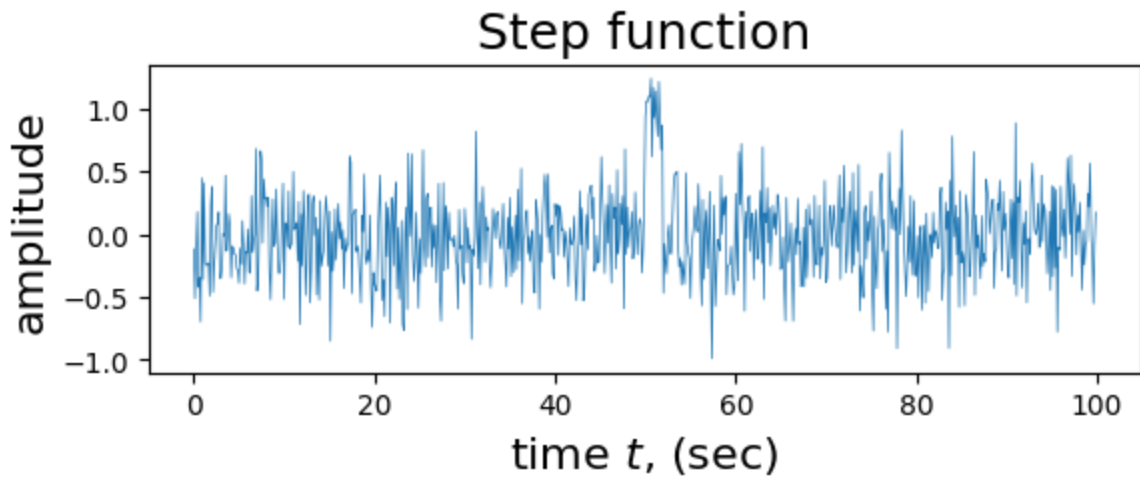
signal start index: 1000/6999
 signal end index: 6000/6999
 snr: 15.478dB

estimated start index: 1203/6999
 estimated end index: 5780/6999
 estimated snr: 8.091dB



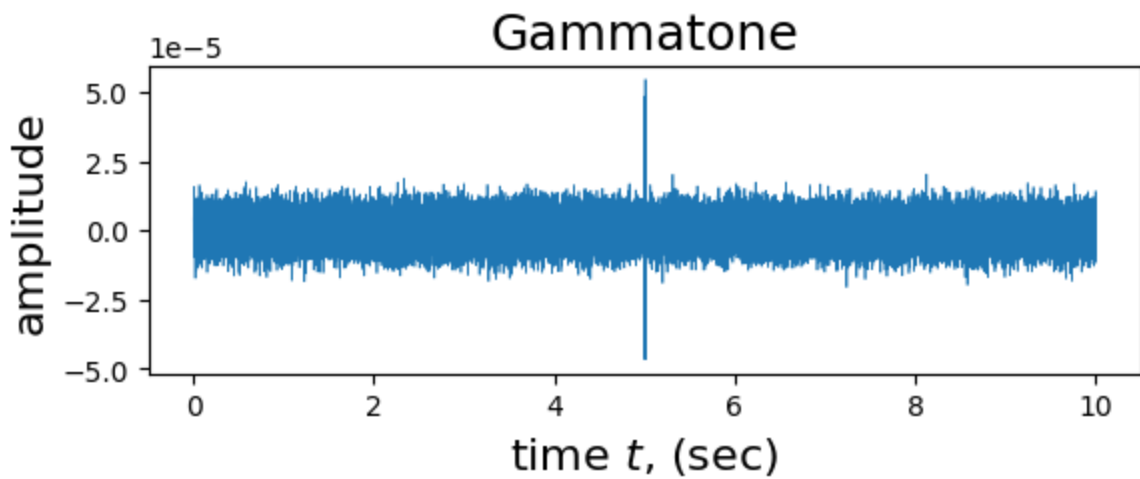
Example: Plot a $2ms$ step function with a delay of $50ms$ in a waveform of $100ms$ with $10dB$ SNR calculated with knowledge of the signal location.

```
In [ ]: fs = 8
tau = 50
T = 2
t, x, _ = a3a.noisysignal(t0=0, tn=100, g=a3a.u, fs=fs, tau=tau, T=T, s=0, tscale=1)
s = a3a.snr2sigma(x[fs*tau:fs*(tau+T)], snr=10)
t, x, n = a3a.noisysignal(t0=0, tn=100, g=a3a.u, fs=fs, tau=tau, T=T, s=s, tscale=1)
plt.figure().set_figheight(2)
a3a.plot_noisysignal(t=t, y=x+n, title="Step function", tunits="sec")
```



4. Grand synthesis

```
In [ ]: t, x, n = a3a.noisysignal(t0=0, tn=10, g=a1b.gammatone, fs=5000, tau=5, T=0.3, s=0.
plt.figure().set_figheight(2)
a3a.plot_noisysignal(t, x+n, title="Gammatone")
scipy.io.wavfile.write("sound.wav", rate=44100, data=(x+n).astype(np.float32)*10000
IPython.display.Audio("sound.wav")
```



Out[]:

