

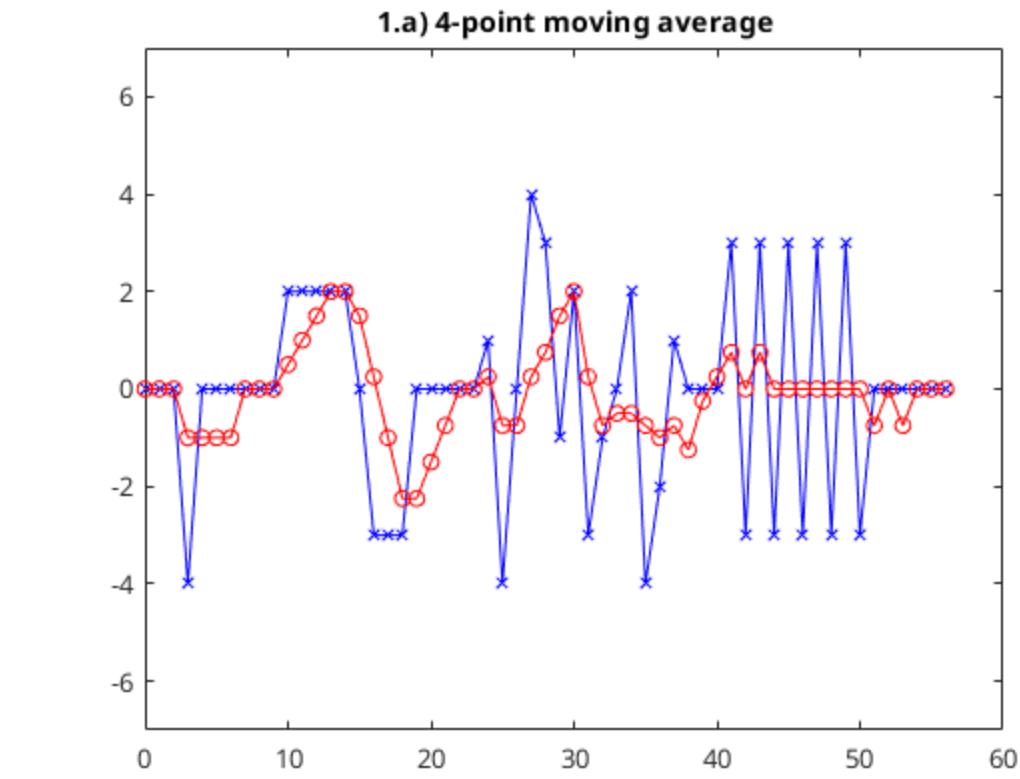
Contents

- 1.a
  - 1.a.i) Exponential Averaging System
    - 1.a.ii) Accumulator
    - 1.a.iii) Backwards Difference System
  - 1.b
    - 1.b) 7 Point Moving Average
      - 1.b.i) Exponential Averaging System
      - 1.b.ii) Accumulator
      - 1.b.iii) Backwards Difference System
  - 1.c
    - 1.c.i) Comparisons
      - 1.c.i) x vs z
      - 1.c.i) x vs u
    - 1.c.ii)
  - 1.d
    - 1.d.i) Comparisons
      - 1.d.i) x vs z
      - 1.d.i) x vs u
    - 1.d.ii)

1.a

```
x = [ 0 0 0 -4 0 0 0 0 0 0 2 2 2 2 ...
2 0 -3 -3 -3 0 0 0 0 0 1 -4 0 4 ...
3 -1 2 -3 -1 0 2 -4 -2 1 0 0 0 3 ...
-3 3 -3 3 -3 3 -3 3 -3 0 0 0 0 0 ];
n = 0:length(x)-1;

a=[1];
b=[1 1 1 1]/4;
y = filter(b, a, x);
figure;
plot(n, x, 'bx-', n, y, 'ro-');
ylim([-7,7]);
title("1.a) 4-point moving average");
```

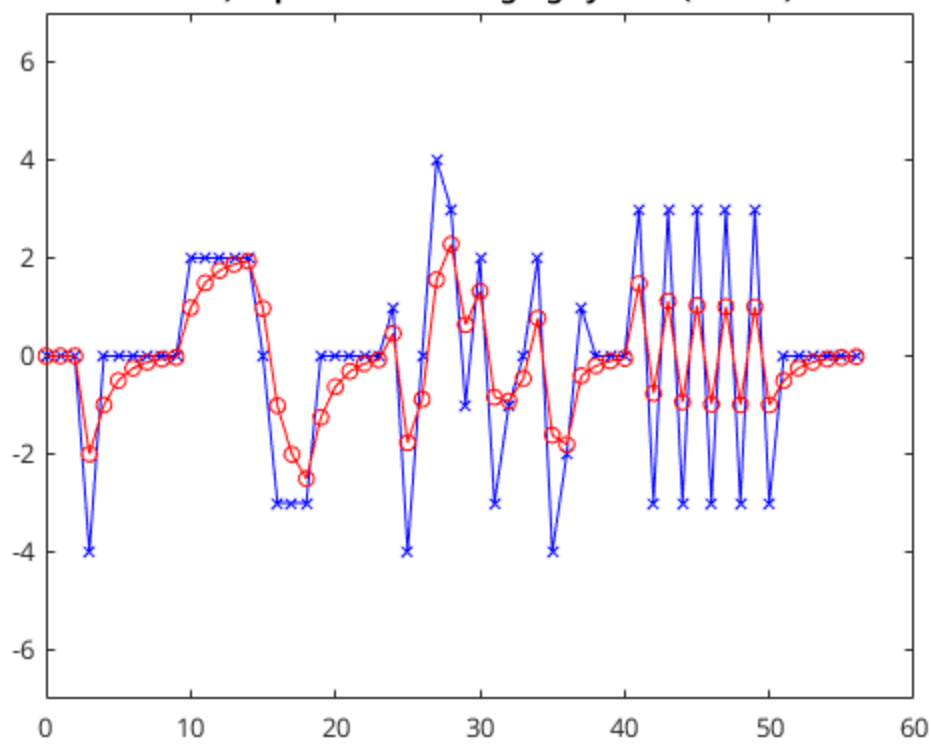


1.a.i) Exponential Averaging System

$$y_n = \alpha * x_n + (1 - \alpha) * y_{n-1}$$
$$\Rightarrow y_n - (1 - \alpha) * y_{n-1} = \alpha * x_n$$
$$\Rightarrow [1, -(1 - \alpha)].[y_n, y_{n-1}] = [\alpha].[x_n]$$

```
alpha = 0.5;
a=[1, -(1 - alpha)];
b=[alpha];
y = filter(b, a, x);
figure;
plot(n, x, 'bx-', n, y, 'ro-');
ylim([-7,7]);
title("1.a.i) Exponential Averaging System ({\alpha = 0.5})");
```

### 1.a.i) Exponential Averaging System ( $\alpha = 0.5$ )



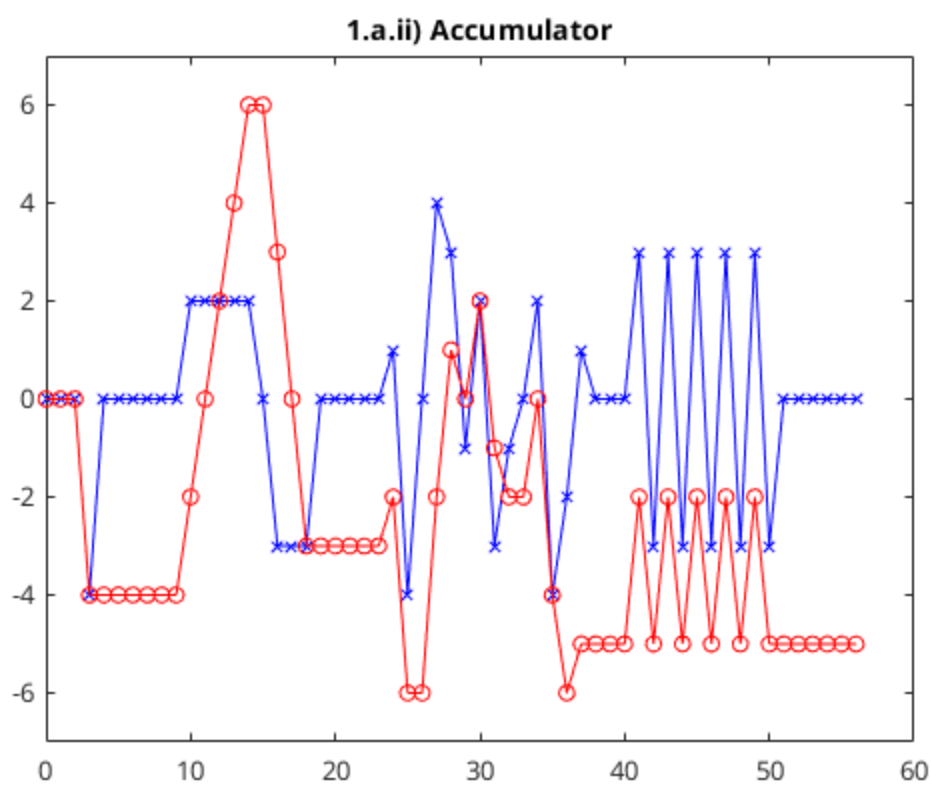
### 1.a.ii) Accumulator

$$y_n = x_n + y_{n-1}$$

$$\Rightarrow y_n - y_{n-1} = x_n$$

$$\Rightarrow [1, -1] \cdot [y_n, y_{n-1}] = [1] \cdot [x_n]$$

```
a=[1, -1];
b=[1];
y = filter(b, a, x);
figure;
plot(n, x, 'bx-', n, y, 'ro-');
ylim([-7,7]);
title("1.a.ii) Accumulator");
```



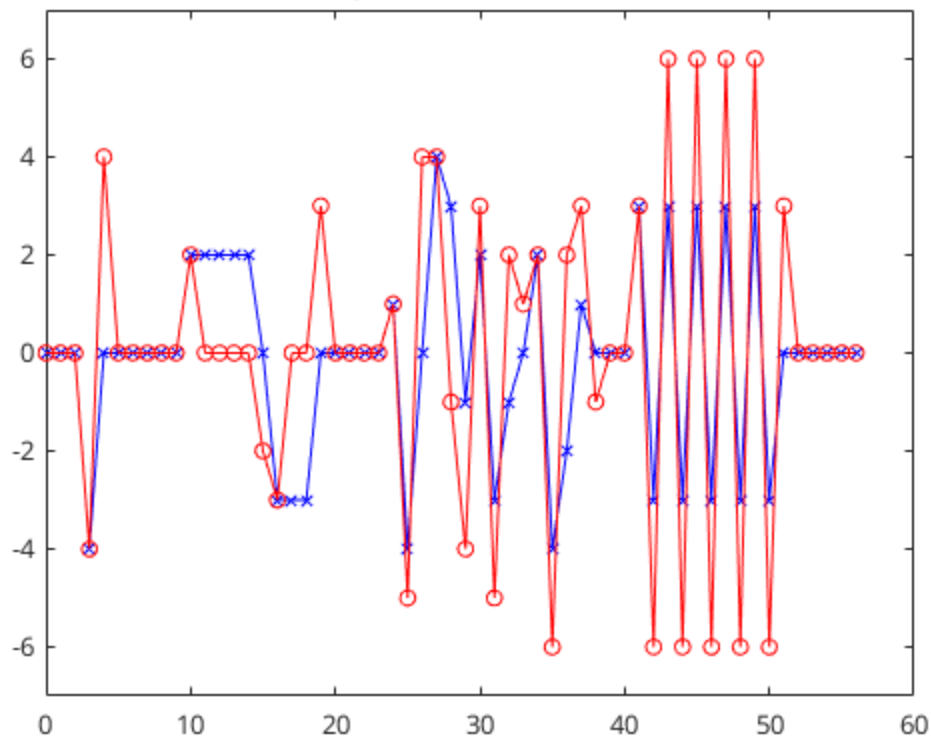
### 1.a.iii) Backwards Difference System

$$y_n = x_n - x_{n-1}$$

$$[1] \cdot [y_n] = [1, -1] \cdot [x_n, x_{n-1}]$$

```
a=[1];
b=[1, -1];
y = filter(b, a, x);
figure;
plot(n, x, 'bx-', n, y, 'ro-');
ylim([-7,7]);
title("1.a.iii) Backwards Difference");
```

1.a.iii) Backwards Difference



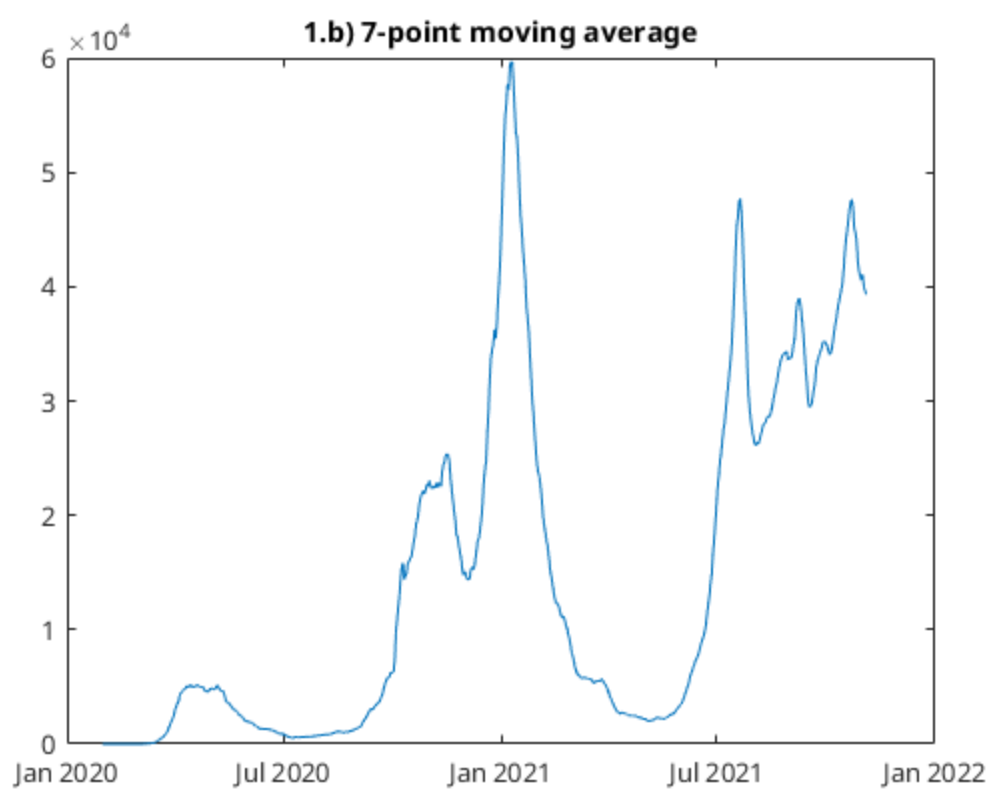
## 1.b

Get table date, taking only the 'date' and 'newCasesByPublishDate' columns

```
newcases = readtable("covid_new_cases_2021_11_04.csv", 'Range', 'D:E');
% Sort table by 'date'
newcases = sortrows(newcases, 1);
% Take x = newcases.newCasesByPublishDate
x = newcases.newCasesByPublishDate;
```

## 1.b) 7 Point Moving Average

```
a=[1];
b=[1 1 1 1 1 1 1]/7;
y = filter(b, a, x);
figure;
plot(newcases.date, y)
title("1.b) 7-point moving average");
```



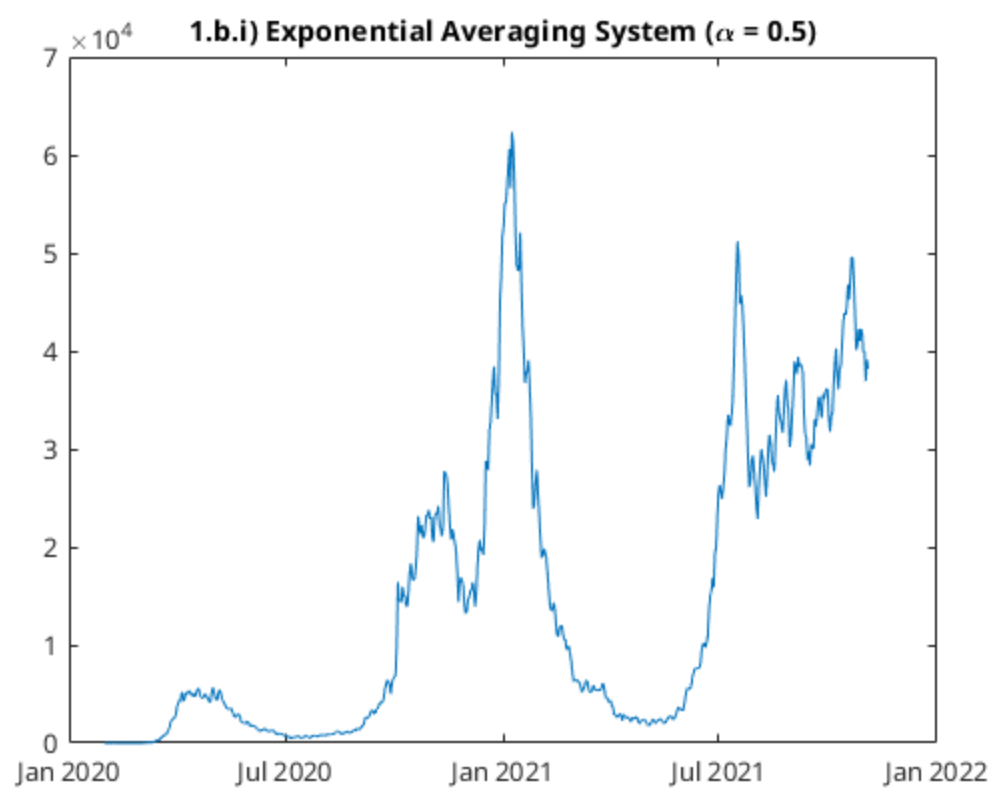
## 1.b.i) Exponential Averaging System

$$y_n = \alpha * x_n + (1 - \alpha) * y_{n-1}$$

$$\Rightarrow y_n - (1 - \alpha) * y_{n-1} = \alpha * x_n$$

$$\Rightarrow [1, -(1 - \alpha)] \cdot [y_n, y_{n-1}] = [\alpha] \cdot [x_n]$$

```
alpha = 0.5;
a=[1, -(1 - alpha)];
b=[alpha];
y = filter(b, a, x);
figure;
plot(newcases.date, y)
title("1.b.i) Exponential Averaging System ({\alpha = 0.5})");
```



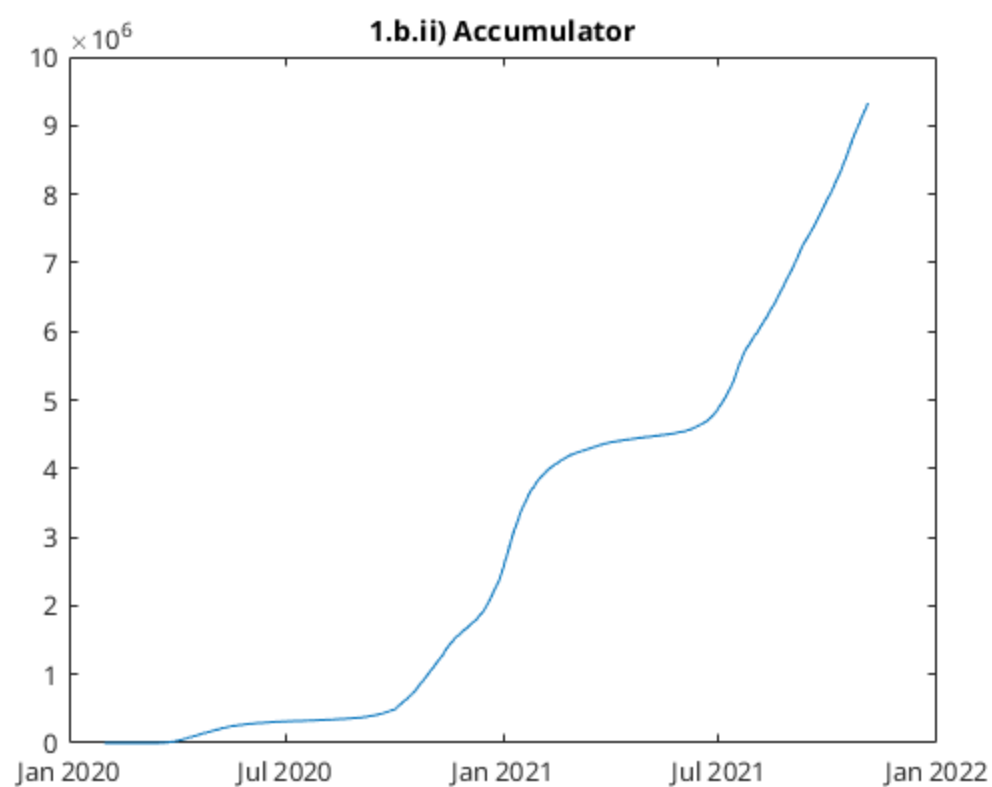
### 1.b.ii) Accumulator

$$y_n = x_n + y_{n-1}$$

$$\Rightarrow y_n - y_{n-1} = x_n$$

$$\Rightarrow [1, -1] \cdot [y_n, y_{n-1}] = [1] \cdot [x_n]$$

```
a=[1, -1];
b=[1];
y = filter(b, a, x);
figure;
plot(newcases.date, y)
title("1.b.ii) Accumulator");
```

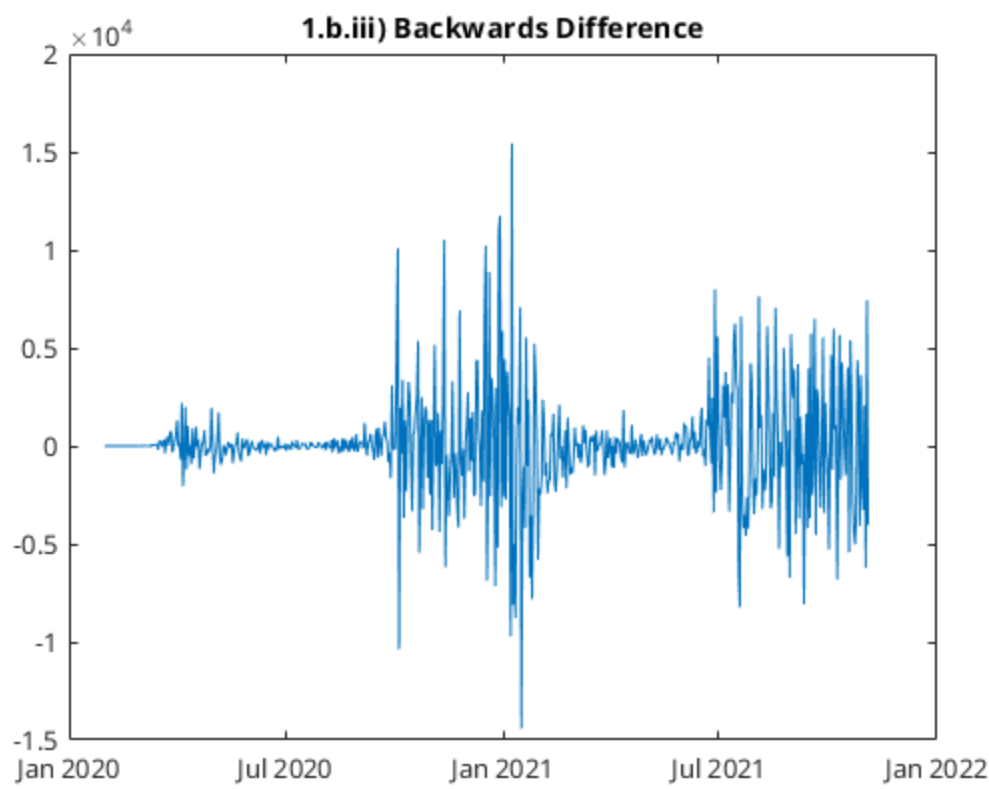


### 1.b.iii) Backwards Difference System

$$y_n = x_n - x_{n-1}$$

$$[1] \cdot [y_n] = [1, -1] \cdot [x_n, x_{n-1}]$$

```
a=[1];
b=[1, -1];
y = filter(b, a, x);
figure;
plot(newcases.date, y)
title("1.b.iii) Backwards Difference");
```



### 1.c

Generate a one second long Gaussian noise sequence  $r$  with a sampling rate of 300Hz

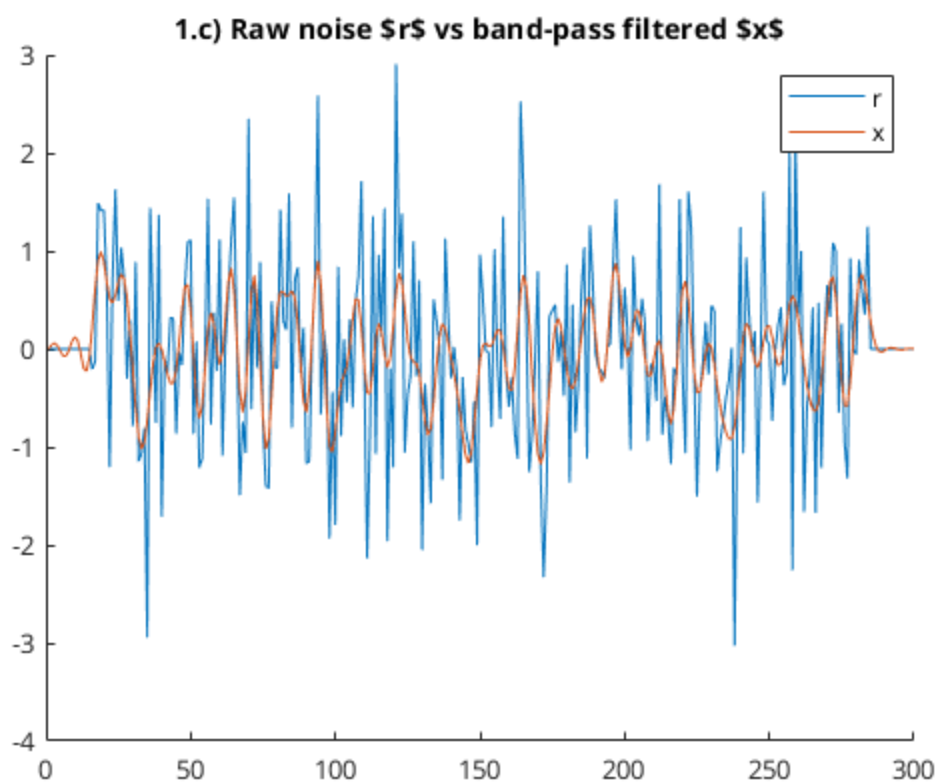
```
f_s = 300;
t = 1; % 1 second long
N = f_s * t;
ts = linspace(1/f_s, t, N);
r = randn(N,1);
% Taper  $r$  by setting its first and last 15 samples to zero.
r(1:15) = 0;
r(end-15:end) = 0;
```

Make a Finite-Impulse Response low-pass filter with cut-off frequency

```
f_c = 45; % cutoff frequency
a = [1]; % FIR has no y-terms
b = fir1(50, f_c/(f_s/2));
% Use the filtfilt function in order to apply that filter to the
% generated noise signal, resulting in the filtered noise signal  $x$ 
x = filtfilt(b, a, r);
```

Plot  $r$ ,  $x$  together.

```
figure;
hold on;
plot(r);
plot(x);
legend("r","x");
title("1.c) Raw noise  $r$  vs band-pass filtered  $x$ ");
hold off;
```



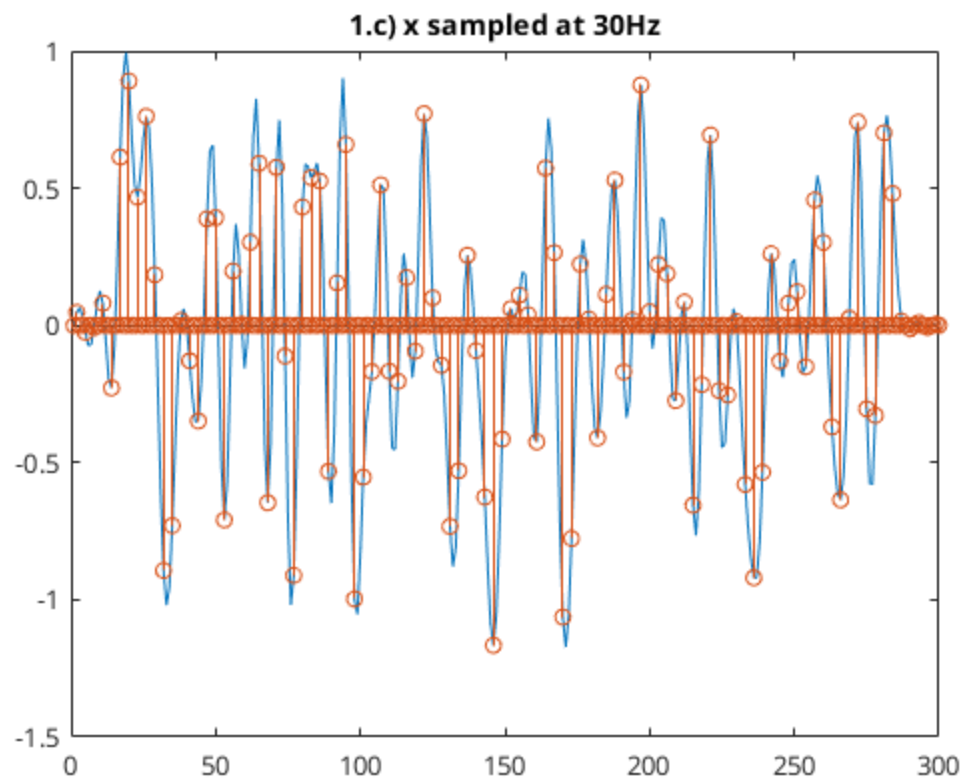
Sample  $x$  at 100Hz by setting all but every third sample value to zero

```

y = x;
% element 1, 4, 7... = 0
y(1:3:end) = 0;
% element 2, 5, 8... = 0
y(3:3:end) = 0;
% element 3, 6, 9... = unchanged

figure;
plot(x);
hold on;
stem(y);
title("1.c) x sampled at 30Hz");
hold off;

```



Implement sinc interpolation to reconstruct the zeroed samples of y

$$x(t) = \sum_{n=-\infty}^{\infty} x_n * \text{sinc}(t/t_s - n)$$

MATLAB version:

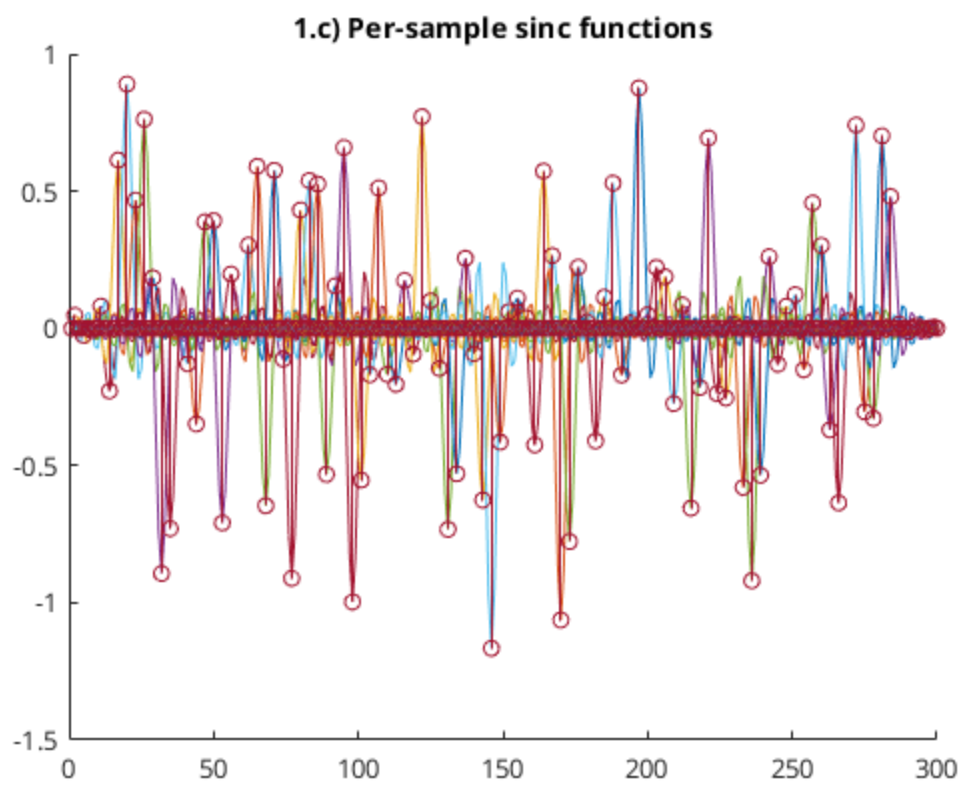
$$z = \sum_{i_y=1}^N y(i_y) * \text{sinc}((ts/t - i_y/N) * f_s/3)$$

Translate the sinc by  $i_y/N$  to align it with the sample, and scale it by  $f_s$  over 3 to align the zero crossings with the other sample points.

```

z = zeros(N,1);
figure;
hold on;
for i_y = 1:N
    data = y(i_y) * sinc((ts/t - (i_y)/N)* f_s/3);
    plot(data);
    z = z + data';
end
stem(y)
hold off;
title("1.c) Per-sample sinc functions")

```



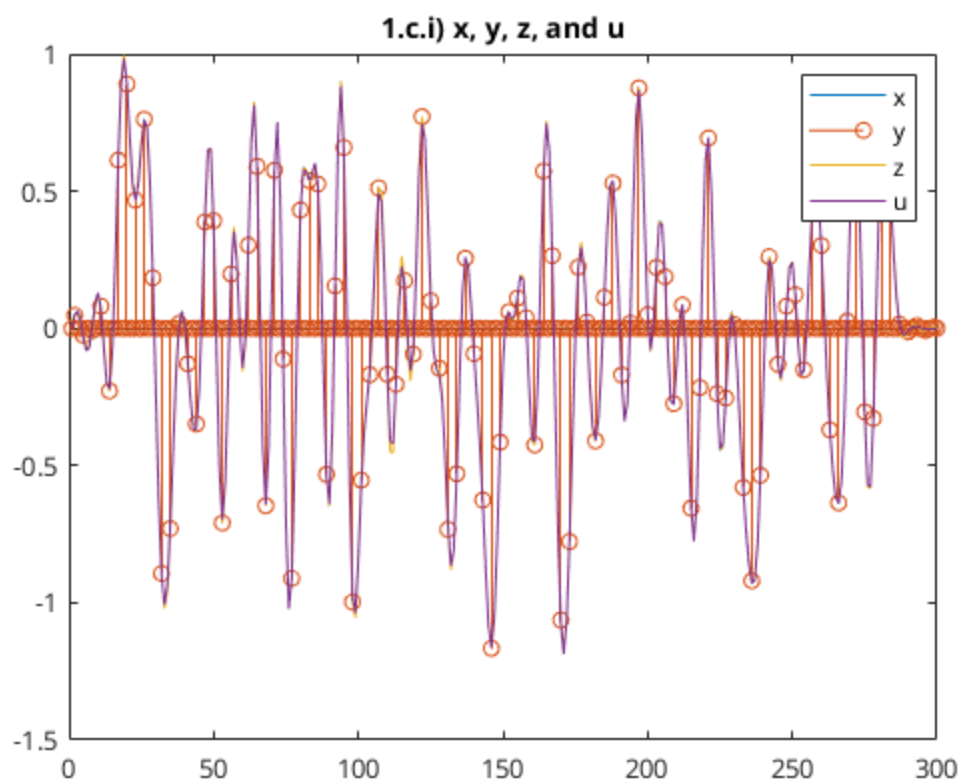
Generate another low-pass filter with fir1, cut-off frequency 50Hz

```
f_c = 50; % cutoff frequency
a = [1]; % FIR has no y-terms
b = fir1(50, f_c/(f_s/2));
% Apply it to y, resulting in interpolated sequence u.
% multiply by 3 to compensate for energy lost during sampling.
u = 3 * filtfilt(b, a, y);
```

### 1.c.i) Comparisons

Plot x, y, z, and u on top of each other in one figure

```
figure;
plot(x);
hold on;
stem(y);
plot(z);
plot(u);
legend("x", "y", "z", "u");
title("1.c.i) x, y, z, and u")
hold off;
```



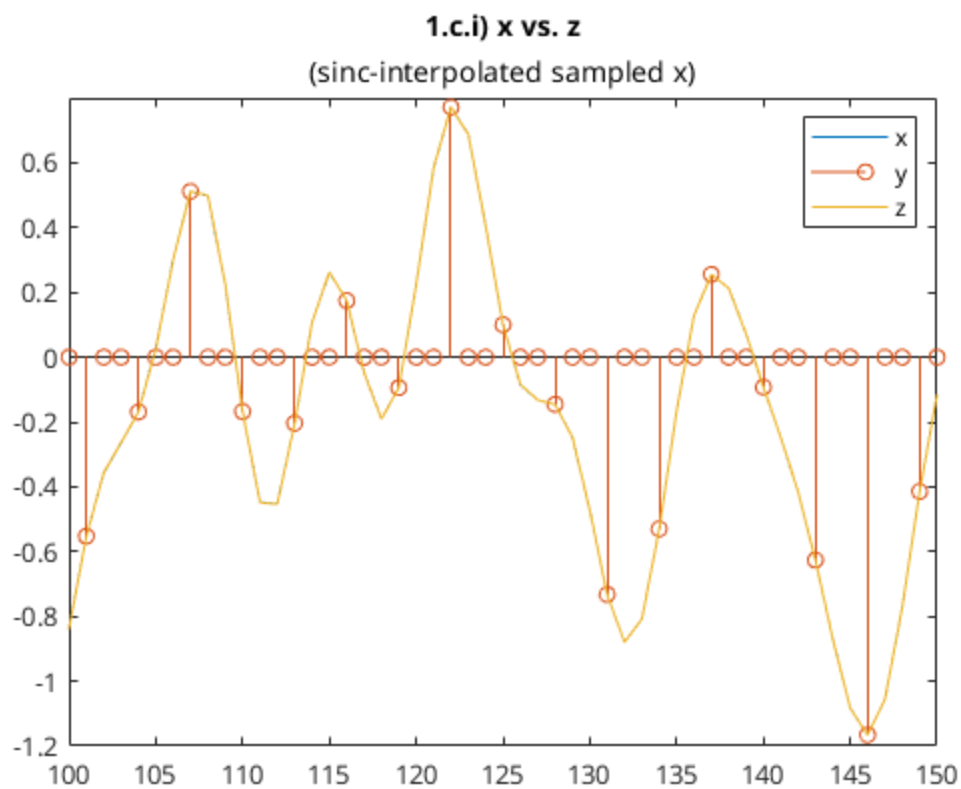
### 1.c.i) x vs z

x and z are equal

```
figure;
plot(x);
hold on;
stem(y);
plot(z);

legend("x", "y", "z");
xlim([100 150]);
```

```
title("1.c.i) x vs. z", "(sinc-interpolated sampled x)");
hold off;
```

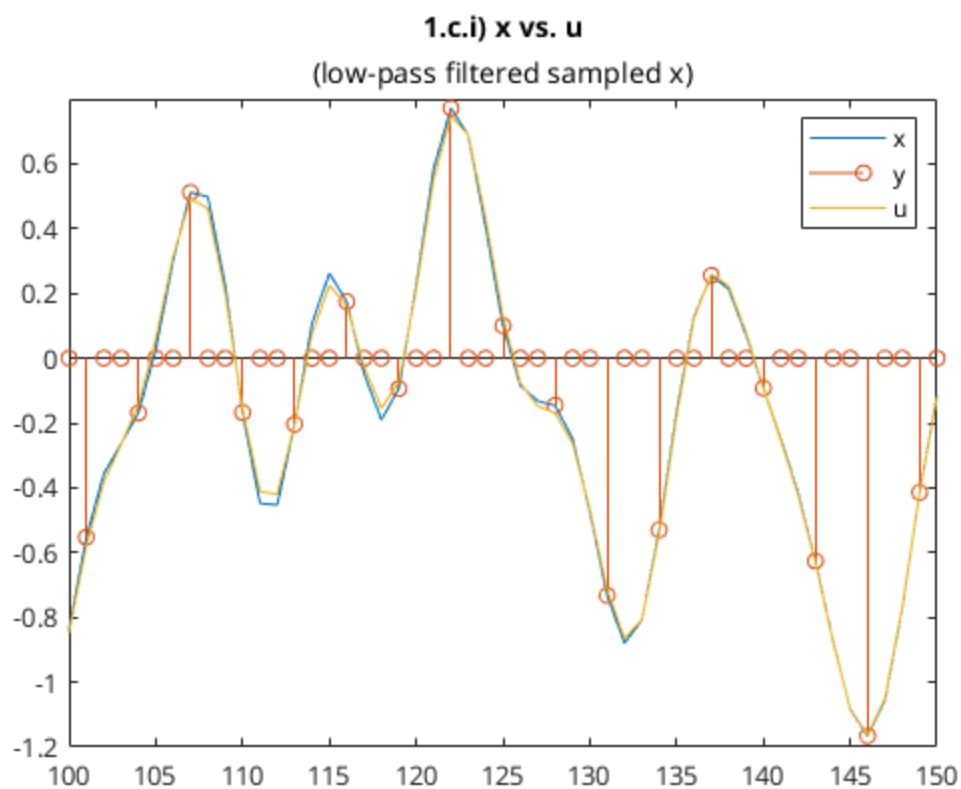


### 1.c.i) x vs u

x and u are similar, but not equal. I think this is because the low-pass filter isn't perfect.

```
figure;
plot(x);
hold on;
stem(y);
plot(u);

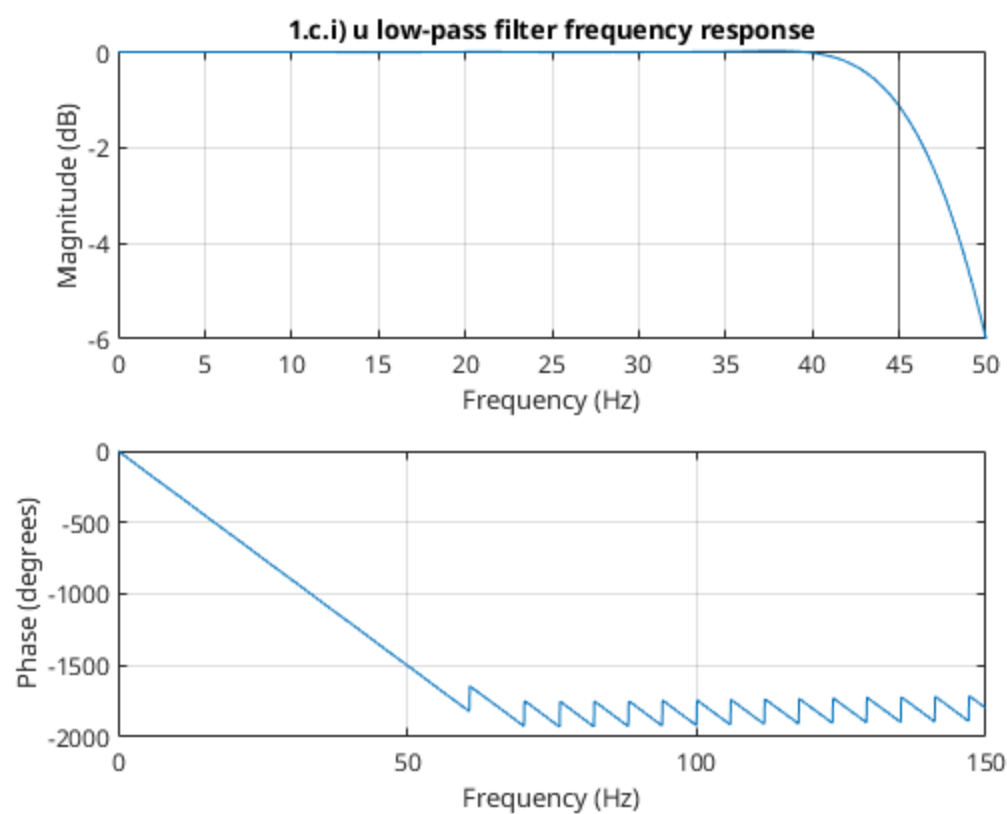
legend("x", "y", "u");
xlim([100 150]);
title("1.c.i) x vs. u", "(low-pass filtered sampled x)");
hold off;
```



Frequency response of the second low-pass filter. The magnitude at the original cutoff (45Hz) is -3dB, so higher frequencies in x were be unfairly reduced when generating u.

```
f_c = 50;
a = [1];
b = fir1(50, f_c/(f_s/2));
figure;
freqz(b,a,2048,f_s);
xlim([0, 50]);
xline(45);
title("1.c.i) u low-pass filter frequency response");
```





### 1.c.ii)

Q: Why should the first filter have a lower cut-off frequency than the second?

If the second low-pass filter had a lower cut-off frequency than the first filter, it would discard higher-frequency information and not reconstruct it.

### 1.d

Simulate the reconstruction of a sampled band-pass signal

Generate a 1 s noise sequence  $r$ , as in part (c)(i), but this time use a sampling frequency of 3 kHz. Set the first and last 500 samples to zero.

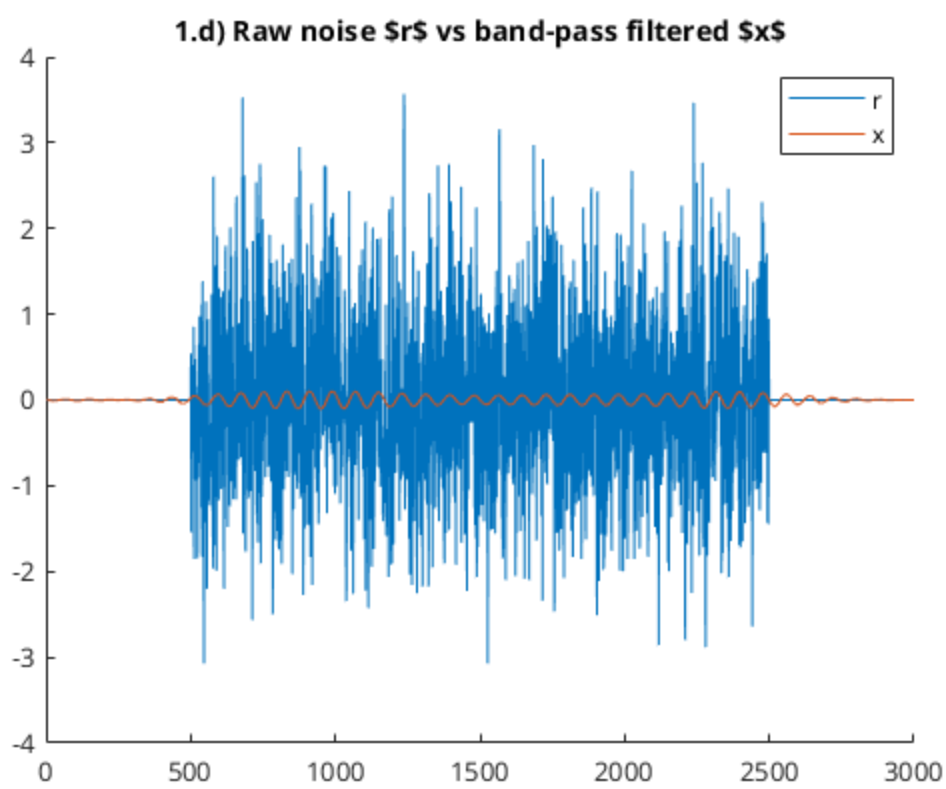
```
f_s = 3000;
t = 1; % 1 second long
N = f_s * t;
ts = linspace(1/f_s, t, N);
r = randn(N,1);
r(1:500) = 0;
r(end-500:end) = 0;
```

Apply a band-pass filter that attenuates frequencies outside 31-44Hz

```
f1 = 31;
f2 = 44;
% 3 = 3rd order filter
% 30 = -30dB for frequencies outside the range
[b, a] = cheby2(3, 30, [f1 f2]/(f_s/2));
% Apply the filter
x = filtfilt(b, a, r);
```

Plot  $r$ ,  $x$  together.  $r$  is very high frequency, so the band-pass will remove a lot and  $x$  will have a much lower amplitude

```
figure;
hold on;
plot(r);
plot(x);
legend("r","x");
title("1.d) Raw noise $r$ vs band-pass filtered $x$");
hold off;
```



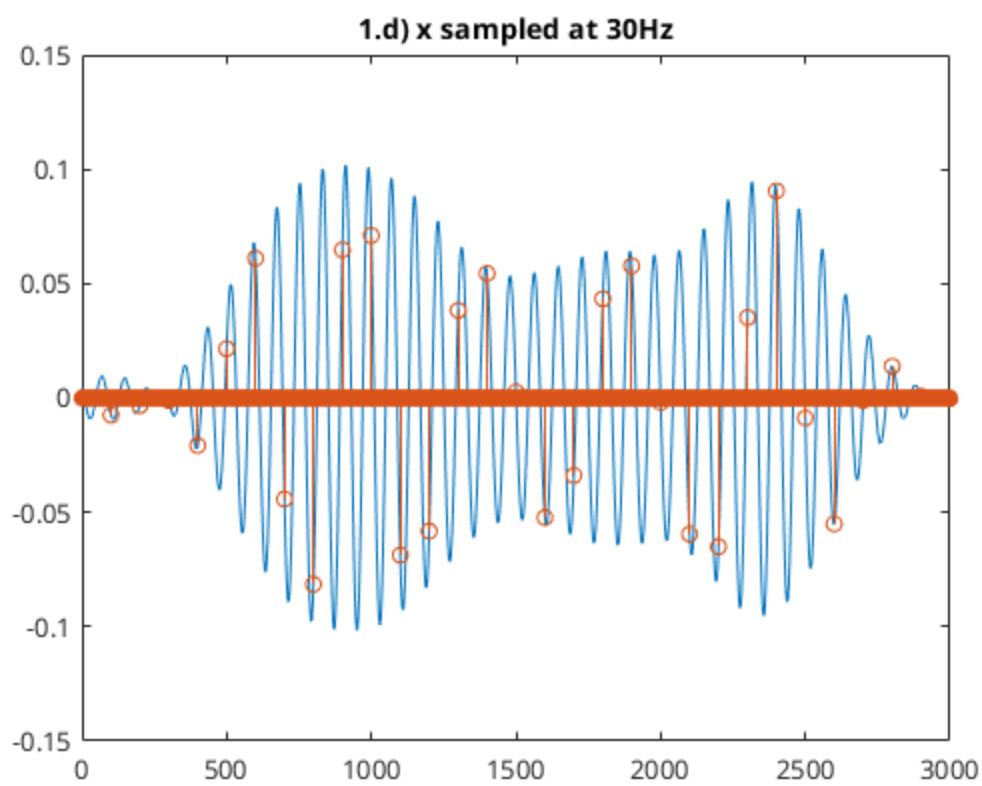
Sample  $x$  at 30Hz, set all but every 100th value to 0

```

y = x;
for i = 1:99
    y(i:100:end) = 0;
end

figure;
plot(x);
hold on;
stem(y);
title("1.d) x sampled at 30Hz");
hold off;

```

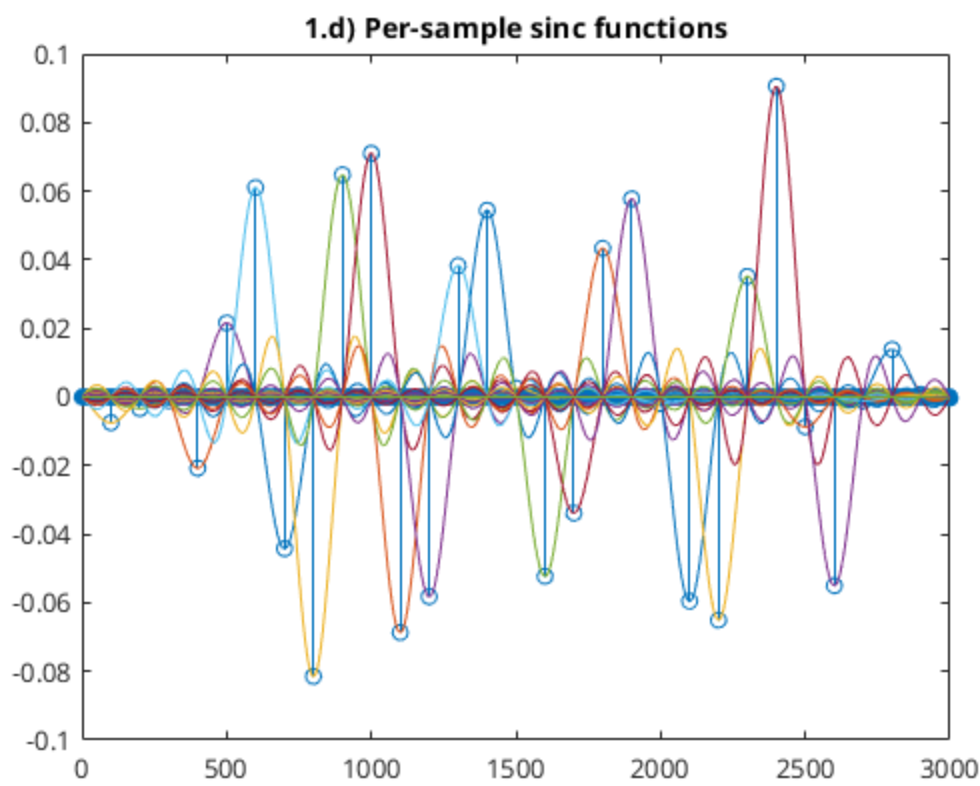


Reconstruct  $y$  with sinc interpolation (see 1.c.i for working) Change the scaling factor to 1/100 instead of 1/3, because we sampled every 100th value

```

z = zeros(N,1);
figure;
stem(y)
hold on;
for i_y = 1:N
    data = y(i_y) * sinc((ts/t - i_y/N) * f_s/100);
    plot(data);
    z = z + data';
end
hold off;
title("1.d) Per-sample sinc functions")

```



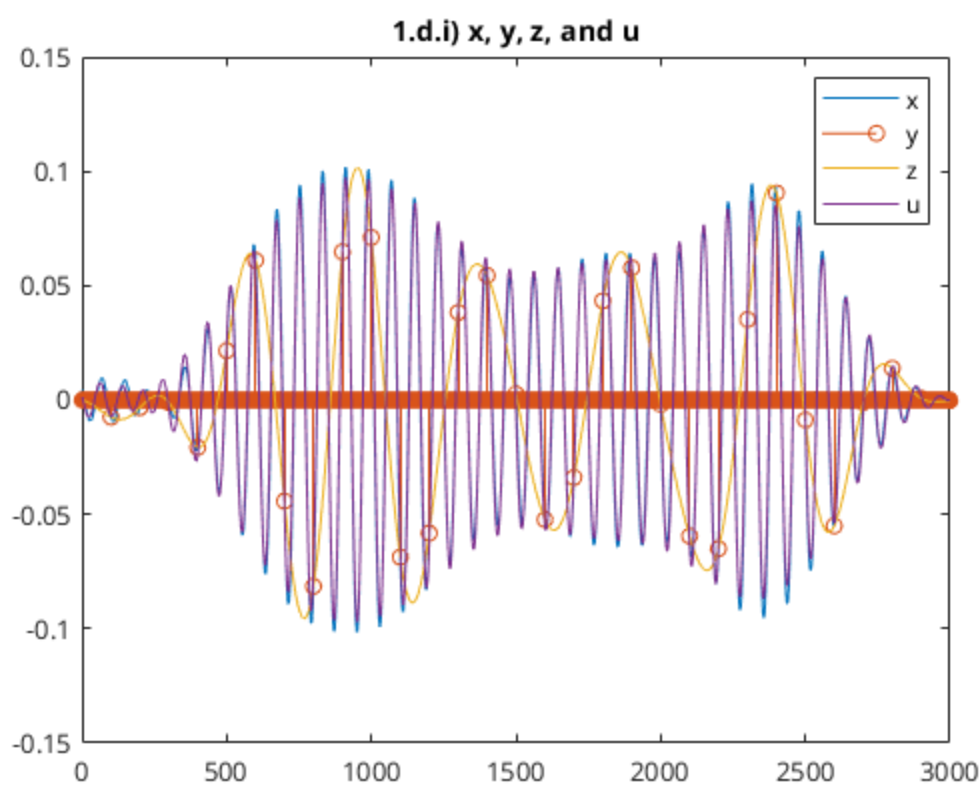
Generate another band-pass filter for 30-45Hz, apply to y to reconstruct as u. Multiply by 100 to compensate for energy lost during sampling.

```
f1 = 30;
f2 = 45;
% 3 = 3rd order filter
% 30 = -30dB for frequencies outside the range
[b, a] = cheby2(3, 30, [f1 f2]/(f_s/2));
u = 100 * filtfilt(b, a, y);
```

### 1.d.i) Comparisons

Plot x, y, z, and u on top of each other in one figure

```
figure;
plot(x);
hold on;
stem(y);
plot(z);
plot(u);
legend("x", "y", "z", "u");
title("1.d.i) x, y, z, and u")
hold off;
```



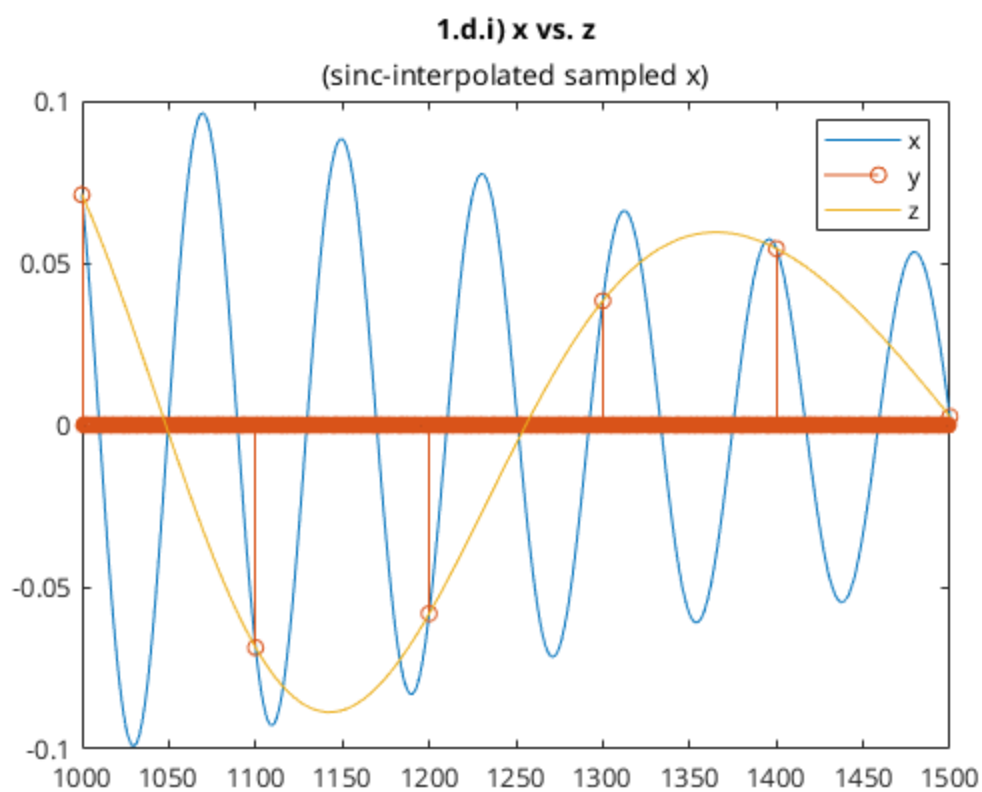
### 1.d.i) x vs z

x and z are not equal - sinc interpolation can only reconstruct frequencies up to  $f_{\text{sample}}/2 = 30/2 = 15\text{Hz}$ , but x contains higher-frequency data.

```
figure;
plot(x);
hold on;
stem(y);
plot(z);

legend("x", "y", "z");
xlim([1000 1500]);
```

```
title("1.d.i) x vs. z", "(sinc-interpolated sampled x)");
hold off;
```

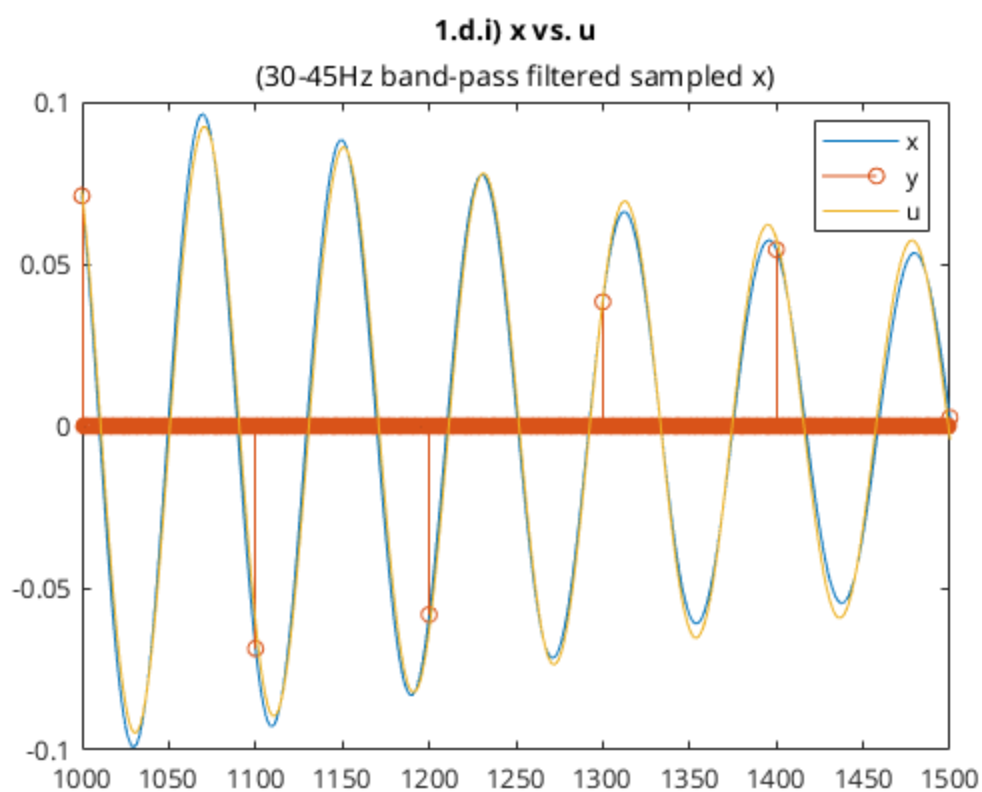


### 1.d.i) x vs. u

x and u are similar, but not equal. I think this is because the band-pass filter is not perfect.

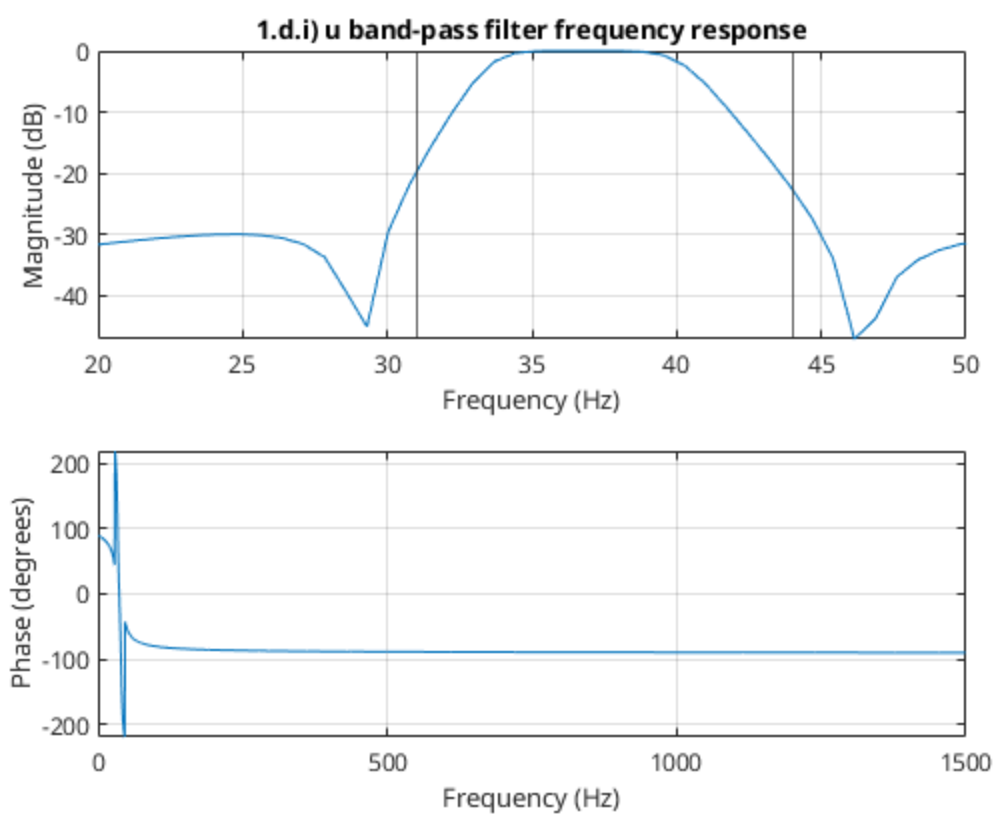
```
figure;
plot(x);
hold on;
stem(y);
plot(u);

legend("x", "y", "u");
xlim([1000 1500]);
title("1.d.i) x vs. u", "(30-45Hz band-pass filtered sampled x)");
hold off;
```



Frequency response of the second band-pass filter. Note that the values for the 31-44Hz range (used to generate x) drop to around -20dB. These frequencies are unfairly reduced when generating u, so it doesn't match x exactly.

```
f1 = 30;
f2 = 45;
[b, a] = cheby2(3, 30, [f1 f2]/(f_s/2));
figure;
freqz(b,a,2048,f_s);
xlim([20, 50]);
xline(31);
xline(44);
title("1.d.i) u band-pass filter frequency response");
```



### 1.d.ii)

Q: Why does the reconstructed waveform differ much more from the original if you reduce the cut-off frequencies of all band-pass filters by 5 Hz?

The question specifically states that the band-pass filters change, but does not state that the sampling frequency for  $y$  changes from 30Hz.

When the band-pass frequencies change,  $x$ 's frequency range is 26-39Hz. The sampling frequency for  $y$ , 30Hz, is within this range. This causes aliasing, which distorts the frequency domain representation (like in slide 58) and thus distorts the output of the low-pass filter.

Before,  $x$ 's range was 31-44Hz, and  $f_y = 30\text{Hz}$  was outside this range, so there wasn't a problem. With the decreased frequencies we can also resolve the problem by decreasing  $f_y$  to 25Hz, and the final figure shows this fixes the issue.

```
% Find x' = x but frequencies reduced by 5
f1 = 31-5;
f2 = 44-5;
[b, a] = cheby2(3, 30, [f1 f2]/(f_s/2));
x_prime = filtfilt(b, a, r);

% Find y'_30 = sampling of x' @ 30Hz
y_prime_30 = x_prime;
for i = 1:99
    y_prime_30(i:100:end) = 0;
end
% Find y'_25 = sampling of x' @ 25Hz
y_prime_25 = x_prime;
for i = 1:119
    y_prime_25(i:120:end) = 0;
end

% Find u' = reconstruction of x' from filter of y' with freqs reduced by 5
f1 = 30-5;
f2 = 45-5;
[b, a] = cheby2(3, 30, [f1 f2]/(f_s/2));
u_prime_30 = 100 * filtfilt(b, a, y_prime_30);
u_prime_25 = 100 * filtfilt(b, a, y_prime_25);

% Plot all
figure;
plot(x_prime);
hold on;
stem(y_prime_30);
plot(u_prime_30);
legend("x'", "y' @ 30Hz", "u' from y' @ 30Hz");
title("1.d.ii) x' vs. u'", "(band-pass frequencies reduced by 5Hz, sampled @ 30Hz)");
hold off;

figure;
plot(x_prime);
hold on;
stem(y_prime_25);
plot(u_prime_25);
legend("x'", "y' @ 25Hz", "u' from y' @ 25Hz");
title("1.d.ii) x' vs. u'", "(band-pass frequencies reduced by 5Hz, sampled @ 25Hz)");
hold off;
```

