Real-Time Digital Signal Processing Speech Enhancement Project Report

Archit Sharma: 01199766

Tomasz Bialas: 01205145

Contents

1	Introduction	3
2	Minimum Noise Buffer	3
3	Enhancements 3.1 Input filtering for noise estimation 3.1.1 Low Pass Filter, magnitude 3.1.2 Low Pass Filter, Power 3.1.3 Band Pass Filter 3.2 Alternative Noise Reduction Formulae 3.3 Oversubtraction 3.4 Residual Noise Reduction 3.5 Frame Length 3.6 Interval Length	4 4 4 4 4 5 6 6
4	Final Implementation	6
5		9 9 9 11
6	Conclusion	11
$\mathbf{A}_{\mathbf{J}}$	ppendices	12
A	Results/Spectrograms	12
В	Code	15

1 Introduction

This project aims to implement a speech enhancer, using the DSK6713 DSP board in real-time. The presented technique will be based on the minimum noise buffering, which estimates the noise present by finding the minimum magnitudes of frequency bins over a given time period. This is then removed from the current input signal. More details of this process are discussed in Section 2. Modifications and extra enhancements made on top of this implementation are discussed and reviewed in Section 3, after which a final implementation is built and tested.

To test the speech enhancer, an audio file from SCRIBE is edited with various noises applied, and then, the speech enhancer is used to see how closely the signal is transformed into the original recording.

2 Minimum Noise Buffer

The technique used to estimate the noise of the signal is known as spectral subtraction [1]. It assumes a noisy signal $X(\omega)$ is equal to a clean signal $Y(\omega)$ plus some noise $N(\omega)$. Therefore, to return $Y(\omega)$, an estimate for $N(\omega)$ must be found first and then spectral subtraction $X(\omega) - N(\omega)$ performed to obtain $Y(\omega)$.

To find $N(\omega)$, this technique takes advantage of the fact that a speech signal is being processed, and thus assumes that within a time interval of approximately 10 s, the speaking person will pause to take a breath (i.e. $Y(\omega) \approx 0$ when the speaker breathes, $X(\omega) \approx N(\omega)$ and if $N(\omega)$ is assumed to be fairly constant, then $N(\omega)$ can be approximated for the time interval at this point). Determining the point at which the speaker takes a breath is done by finding the magnitude of each frequency bin for each input frame and by finding the minimum magnitude for each frequency bin over the time interval.

While this method would work, it requires the DSP to store the magnitude spectrum of each frame over the 10 s period. A frame is processed over a 32 ms so 312.5 magnitude spectra need to be stored as 32-bit floats, and if an FFT of size 256 is used then the memory needed is 320kB. A way to reduce this memory requirement is to split the 10 s interval into four 2.5 s intervals and store the smallest recorded magnitude per frequency bin over these smaller intervals. After 2.5 s, the buffers rotate, with the oldest buffer then getting overwritten by the next input frame. $N(\omega)$ is then estimated by selecting the magnitude spectrum with the smallest total magnitude across all frequency bins from the four buffers. This method provides a decent estimation of $N(\omega)$ while storing only 4kB of data, a considerable saving.

The second part of the process is to subtract $N(\omega)$ from $X(\omega)$. However, the phase of the noise is unknown and instead, the magnitudes are subtracted only:

$$Y(\omega) = X(\omega) \times \left(1 - \frac{|N(\omega)|}{|X(\omega)|}\right) = X(\omega) \times g(\omega), \tag{1}$$

where $g(\omega) = \max\{\lambda, 1 - \frac{|N(\omega)|}{|X(\omega)|}\}$ to prevent negative values. It is important to note that broadband noise is random and may have peaks at random positions in the spectrum, which change location at every frame. As such, zeroing the spectrum may cause large valleys in the spectrum, causing "musical noise" with rapidly changing notes. In order to limit this effect, a small constant λ is introduced to prevent very high valleys and peaks in the spectrum. Typically, $\lambda = 0.01$ to $\lambda = 0.1$. As $N(\omega)$ is the estimated minimum noise over a period, it is likely that the noise applied to $X(\omega)$ at the current frame will be greater than the minimum being used, so $N(\omega)$ is then scaled by a constant α , initially set to 20.

The baseline algorithm was implemented and tested qualitatively in order to compare any enhancements and modifications performed. The baseline approach was found to have good a broadband noise removal, at the cost of high levels of musical noise added.

3 Enhancements

Several methods were used to improve the noise reduction of the original algorithm are described in Berouti et al., (1979) [1]. While preserving an acceptable quality of speech, only a few of those were selected for the final implementation. This was caused by the limited processing resources of the DSP and the fact that execution must be kept in real-time. Additionally, some enhancements did not improve the results and degraded the final solution.

3.1 Input filtering for noise estimation

3.1.1 Low Pass Filter, magnitude

An additional array containing the low pass filtered version of the input array was added. A pointer for the input to the noise estimation algorithm was also added, such that the estimate is performed on the low-pass version. This new array was computed based on the following formula:

$$P_t(\omega) = (1 - k) \times |X(\omega)| + k \times P_{t-1}(\omega), \tag{2}$$

where $k = \exp(-T/\tau)$. This method allowed for a noticeably improved noise suppression, and allowed to decrease the α value from 20 to 5. As a side effect, however, musical noise was added in the system, most likely resulting from the higher level difference between speech and the suppressed parts of the spectrum. This method was retained for the final implementation of the speech enhancement system.

3.1.2 Low Pass Filter, Power

A second version of the low pass filter enhancement was added, which instead of applied the formula to the magnitude spectrum $X(\omega)$, is applied to $X(\omega)^2$. The values are then converted back to magnitude values for further processing, as square root is computed.

Filtering in the power spectrum was expected to yield superior results to magnitude, as it should allow for more effective estimation of the noise and thus stronger suppression. During testing, better noise reduction was observed, however higher amounts of musical noise and heavy distortion were applied to the voice of the speaker. It was effectively "drowned out" by the musical noise. Due to those effects, this method was not selected for the final implementation.

3.1.3 Band Pass Filter

An attempt at bandpass filtering for more effective noise reduction was made by using the spectrum from approximately 300 Hz to 3.4 kHz, as typically used in telephone systems. As no improvement was achieved and the levels of musical noise resulted in unintelligible rendering of the speech, this method was not retained for the final implementation.

3.2 Alternative Noise Reduction Formulae

The initial noise removal is done by subtraction of the estimated noise magnitude through the formula $g(\omega) = \max\{\lambda, 1 - \frac{|N(\omega)|}{|X(\omega)|}\}$. In this section, several alternative formulae are implemented, and compared against the reference original implementation.

In the test code during the project development, a large switch statement was used to switch between different formulas, and compare their effects when integrated to the system.

$$g(\omega) = \max \left\{ \lambda \frac{|N(\omega)|}{|X(\omega)|}, 1 - \frac{|N(\omega)|}{|X(\omega)|} \right\}$$
(3)
$$g(\omega) = \max \left\{ \lambda \frac{|P(\omega)|}{|X(\omega)|}, 1 - \frac{|N(\omega)|}{|X(\omega)|} \right\}$$
(4)

$$g(\omega) = \max \left\{ \lambda \frac{|N(\omega)|}{|P(\omega)|}, 1 - \frac{|N(\omega)|}{|P(\omega)|} \right\}$$
 (5)
$$g(\omega) = \max \left\{ \lambda, 1 - \frac{|N(\omega)|}{|P(\omega)|} \right\}$$
 (6)

An additional switch has been implemented to test those formulae, replacing noise estimates in magnitude to estimates in the power domain, as calculated in the array mentioned in section 3.1. However, due to increased musical noise, crackle and occasional voice distortion, power domain noise estimations were not selected for the final implementation.

After testing, the equation (5) was identified as ineffective and subjectively marked as worse than the baseline in terms of noise spectrum removal. This may be explained by its use of the low-pass noise estimate as the denominator of the attenuation equation, which gives a value that is a function of those quantities, and is not directly related to the original signal and the amount of noise that requires removal. This equation did not cause musical noise or distortion but low noise rejection rendered it unfit for purpose.

The equation (6), while constructed similarly to (5), was found to have a slightly higher noise removal effect on the output. Broadband noise remained high, and additional musical noise was introduced.

Finally, the equations (3) and (4) were found to give adequate wideband noise reduction with bearable amounts of musical noise introduced. They also showed lower levels of musical noise compared to the baseline. However, those implementations introduced a decrease in quality of the speech as well as crackling into the sound.

3.3 Oversubtraction

3.4 Residual Noise Reduction

Residual noise reduction technique, as described in Boll, (1979) [2], is said to reduce musical noise. The process shown by the equation (7) states that if signal after processing $X(\omega')$ is less than some threshold η , then the output is the minimum of $X(\omega')$ across three adjacent frames - the current frame, the past frame and the next frame. This means that the output must be delayed by minimum of one frame to do this process. However, the delay of at least 32 ms would not be hugely noticeable to the human ear.

$$Y(\omega)_t = \begin{cases} X(\omega')_t, & X(\omega')_t \ge \eta \\ v & \text{where} \quad v = \min\{X(\omega')_{t-1}, X(\omega')_t, X(\omega')_{t+1}\}, & X(\omega')_t < \eta. \end{cases}$$
(7)

Because phase is being ignored, v is equal to some $X(\omega')$ which has the minimum magnitude across the three frames. Residual noise reduction works by taking advantage of the random nature of musical noise. It jumps between frequencies very quickly, so by observing adjacent frames, the musical noise will be at different frequencies. As long as the changes in the musical noise frequency are large enough to apply to different frequency bins and it does not overlap with the frequencies apparent in the clean signal, the minimum should be found and the musical noise reduced to a more consistent and less annoying hum. This decreases the previously mentioned risk of having large peaks and valleys in the spectrum, thus reducing the musical noise.

The residual noise reduction considerably reduced the amount of musical noise from the output when compared with the baseline implementation and thus will be considered for the final implementation.

3.5 Frame Length

Frame length has been set by default to 256 bins. An attempt has been made to increase the frame length to 512 as suggested to reduce musical noise, at the risk of having slurred-sounding speech. However, during testing, it has been shown that sound was heavily slurred, and that the higher size of the frame caused the CPU load to increase too much, causing skipped frames and crackling at the output. For those reasons, the frame length was left unchanged for the final implementation.

3.6 Interval Length

In order to decrease processing time and to make the system faster responding to noise, the processing interval length has been decreased from the default value of 10 s to 5 s or 2.5 s. However, this caused increased music noise, voice distortion and crackling, and an overall heavily impacted noise reduction performance.

The processing interval was left unchanged for the final implementation.

4 Final Implementation

When testing all the enhancements, a test bench with switches that could be used in the CCS debugger was created. Only the code implementing the enhancements described in Section 3 is showcased here, the full code can be found in Appendix B.

In Figure 1, fftframe is the input signal after an FFT, process_buf points to the buffer in which processing will next occur and the other buffers store power and magnitude of the input signal before and after low pass filtering. Of note is that the cabs function is deconstructed here and the stages during that calculation are stored in an appropriate buffer. This is to save cycles later as some of the noise reduction formulae in Section 3.2 use these buffers to when calculating the output signal.

Figure 1: Low pass filter code

To implement the minimum noise buffer rotation, the code in Figure ?? is used. The buffers rotate when frame_count reaches 78 as with frame processing times of 32 ms and a buffer interval time of 2.5 s, 78.125

frames are needed per buffer interval, which is then rounded down to 78. When the buffers rotate, the new buffer being written to is overwritten by the spectrum of the current frame (line 18) to prevent any information from beyond the wanted time interval of $10\,\mathrm{s}$ impacting the speech enhancer. However, this means that the period of time from which the noise is estimated actually varies linearly between $7.5\,\mathrm{s}$ and $10\,\mathrm{s}$.

Figure 2: Buffer rotation and update code

Figure 3 shows how the minimum buffer is determined. First it calculates the magnitude sum of m1 as it will very often change due to it updating per frame. The magnitude sums of the other buffers are fixed after the buffer is no longer being written to, and so are rotated along with the buffers themselves in Figure 2 to save clock cycles. The magnitude sums are then compared and min_buf then points to the minimum buffer. The power of that buffer is then calculated and stored in noise_pow.

```
//calculate ml magnitude sum
magl=0;
for (k=0;k<FFTLEN;k++)

{
    magl += m1[k];
}

//finds buffer with smallest magnitude sum, points min_buf to that buffer
if (magl < mag2 && mag1 < mag3 && mag1 < mag4) min_buf = m1;
else if (mag2 < mag3 && mag2 < mag4) min_buf = m2;
else if (mag3 < mag4) min_buf = m3;
else if (mag3 < mag4) min_buf = m3;

//finds power buffer of that minimum noise buffer

for (k=0;k<FFTLEN;k++)

{
    noise_pow[k] = min_buf[k]*min_buf[k];
}
```

Figure 3: Minimum buffer code

The code in Figure 4 show cases how noise reduction formulae in 3.2 were switched between. Depending on g_pow and g_omega, lambda_bot, lambda_top, signal_top and signal_bot point to buffers for the appropriate formulae. In the case of λ not being multiplied by anything, lambda_bot and lambda_top point to a buffer filled with ones to keep the code readable. The reasoning behind this method becomes apparent in Figure 5.

```
//points lambda and signal pointers to relevent buffers depending on g_omega and g_pow
if (g_omega == 1)
{
lambda_top = min_buf;
lambda_bot = mag_buf;
if (g_pow)
{
    signal_top = noise_pow;
    signal_bot = pow_buf;
}
else
{
    signal_top = min_buf;
    signal_top = min_buf;
    signal_top = min_buf;
    signal_top = min_buf;
}
```

Figure 4: Example of noise reduction code

Figure 5 shows how the noise reduction is implemented. By using a generic formula with lambda_bot, lambda_top, signal_top and signal_bot, the code is very readable despite whilst being able to switch between formulae. Of note is that when residual is on, the processed signal is also stored in resframe0.

Figure 5: Noise reduction code

Figure 6 shows how residual noise reduction is implemented. resframe1 is the central frame, delayed by one frame with resframe0 relatively one frame ahead and resframe2 relatively one frame behind. The reasoning for this is described in Section 3.4.

```
//calculates and removes residual noise

if (residual)

{
   complex *temp = resframe2;
   float *temp.mag = resframe2_mag;
   for (k=0;k<FFTLEN;k++)

{
        //checks frequency bin against threshold
        if (resframe1_mag[k] < res-thresh)

{
        //finds minimum in adjacent frames
        if (resframe1_mag[k] < resframe0_mag[k] && resframe1_mag[k] < resframe2_mag[k]) fftframe[k] =
        resframe1[k];
        else if (resframe2_mag[k] < resframe0_mag[k]) fftframe[k] = resframe2[k];

}

//rotate residual buffers
   resframe2 = resframe0;
   resframe1 = resframe0;
   resframe0 = temp;

resframe0 = temp;

resframe0_mag = resframe0_mag;
   resframe1_mag = resframe0_mag;
   resframe0_mag = temp_mag;
}
```

Figure 6: Residual noise reduction code

$$g(\omega) = \max(\lambda N(\omega), 1 - N(\omega)) \tag{8}$$

After testing using the selectable implementations, the method explained in the Berouti paper has been selected, with $\alpha = 5$, $\lambda = 0.08$, filter constant 0.7.

5 Testing

5.1 Method

Quantifying speech quality is difficult, as the perceived quality of speech can be based on many different parameters of the sound.

In order to test the speech enhancement system, two separate people would listen to the processed recording independently and then share their opinions in order to stay as objective as possible and avoid any biases. In case of conflicting opinions, judgements and justifications would be shared, and an agreement would be reached in order to match the listening test criteria as much as possible.

The design was tested against all provided sound files in order to have the widest selection of scenarios. The tested sound files were clean, car1, factory1, factory2, lynx1, lynx2, phantom1, phantom2, phantom4. Due to its low SNR, phantom4 was not selected as a priority target for optimisation, as it was considered an edge case and optimisation for it caused degradation of quality in all other test cases.

During testing, a large amount of potential improvements has been rejected. Those improvements have been detailed in section 3.

Finally, an attempt to quantify the performance of the final selected design was done by recording the outputs and plotting the spectra of the different sound files.

5.2 Results

This section discusses a selected range of test results to show the system performance as well as its limits.

In the clean test case, the resulting spectrum was generated as expected. The spectral components of speech remained relatively unaffected, as showed by the similarity of vertical stripes in Figure 15. It can be observed that periods with no speech activity have been quieted down, even with the absence of original noise, the low background noise has been still attenuated.

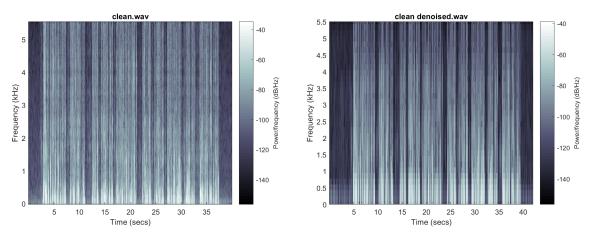


Figure 7: clean file, unprocessed

Figure 8: clean file, processed

The factory1 test case shows the system operating in nominal conditions. The background noise has been mostly removed and periods of no voice activity can be observed on the diagram in Figure ??. Initial noise can be seen before the 5 seconds mark, after which, the noise reduction algorithm starts correctly attenuate the noise.

On the same recording, lighter sections can be seen at high frequencies at the 12, 15 and 24 seconds mark. This may be caused by sudden sounds, such as shocks and hits in the factory background noise that the system did not fully attenuate as it relies on an average noise estimate. Using statistical methods to model for such noises might be a possible solution to this issue.

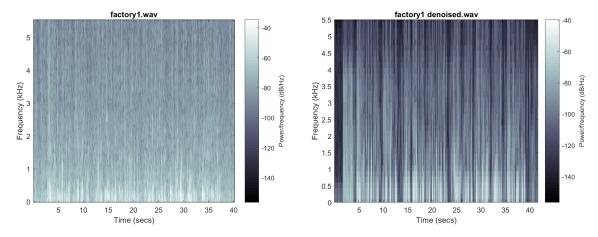


Figure 9: factory1 file, unprocessed

Figure 10: factory1 file, processed

Finally, in the phantom4 test case, a degraded performance can be observed. It can be seen on the unprocessed file in Figure 30, the low SNR of the original recording. Additionally, constant noise at harmonic frequencies can be seen, which propagates to the output of the speech enhancement system, as shown in Figure ??. That periods of no speech activity still show audio activity on the output, as the system did not handle a very low SNR ratio.

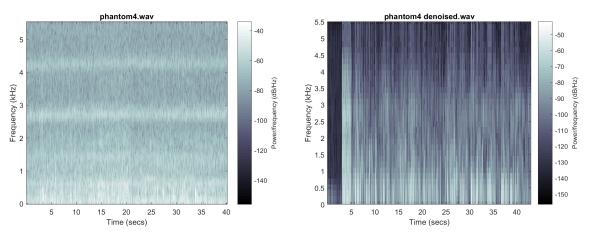


Figure 11: phantom4 file, unprocessed

Figure 12: phantom4 file, processed

However, in most cases the system outputted intelligible speech. Full test results are located in Appendix A.

5.3 Performance

Clock profiling of each enhancement was taken. When measuring the clock cycles, the numbers observed varied wildly so the results given in Figure 13 are approximate.

Enhancement	Cycles
Baseline	230000
Magnitude filtering	8000
Power filtering	47000
Residual	240000
Power Noise Reduction	70000

Figure 13: Approximate clock cycles of enhancements

From the results it becomes apparent why residual noise reduction would not work alongside the other enhancements. The number of clock cycles required to use it is considerably larger than other enhancements, and when used in conjunction with others would overrun the available CPU time.

6 Conclusion

The aim of the project was to implement a working speech enhancement system based on the spectral subtraction method and to implement, evaluate and select additional enhancements to provide optimal noise reduction performance while keeping high speech quality.

A functional system has been built, reducing background wideband noise. A compromise has been reached between speech quality, wideband noise subtraction, musical noise presence and processing time in order to meet optimum noise removal in most scenarios. Some edge cases, such as the low SNR signal in the phantom4 test case, demonstrate the limitations of the chosen design. Possible additions could include processing time optimisation, implementation of oversubtraction methods for α adjustment or the addition of the omitted residual noise reduction for performance reasons and as a result these could improve noise removal process.

Appendices

A Results/Spectrograms

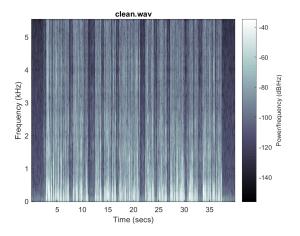


Figure 14: clean file, unprocessed

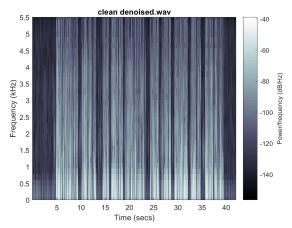


Figure 15: clean file, processed

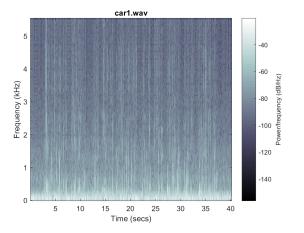


Figure 16: car1 file, unprocessed

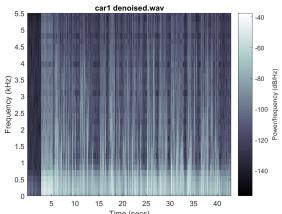


Figure 17: car1 file, processed

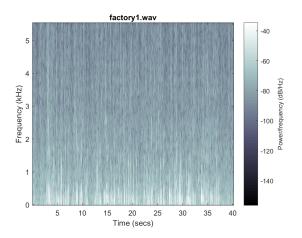


Figure 18: factory1 file, unprocessed

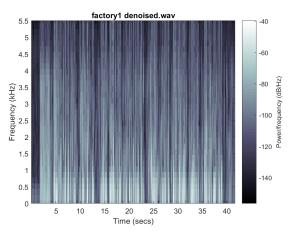


Figure 19: factory1 file, processed

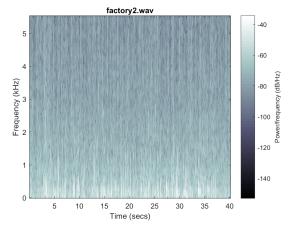


Figure 20: factory2 file, unprocessed

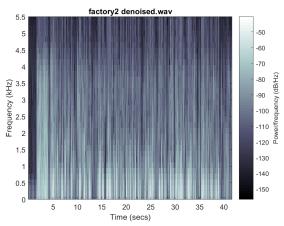


Figure 21: factory2 file, processed

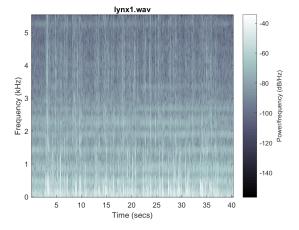


Figure 22: lynx1 file, unprocessed

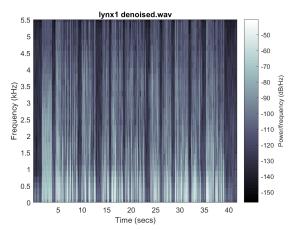


Figure 23: lynx1 file, processed

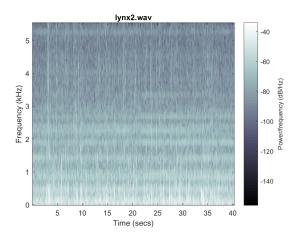


Figure 24: 1ynx2 file, unprocessed

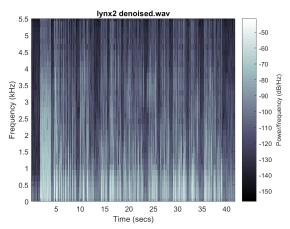


Figure 25: lynx2 file, processed

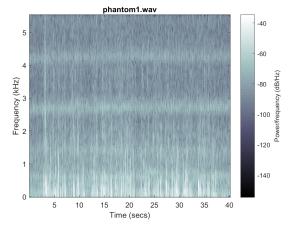


Figure 26: phantom1 file, unprocessed

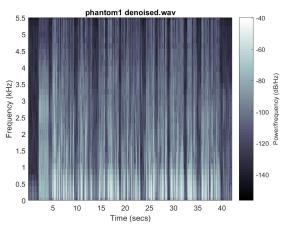


Figure 27: phantom1 file, processed

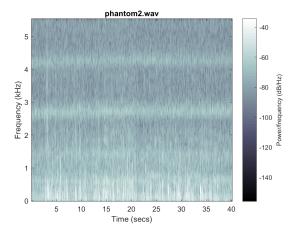


Figure 28: phantom2 file, unprocessed

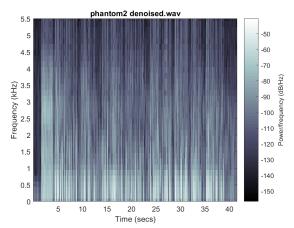
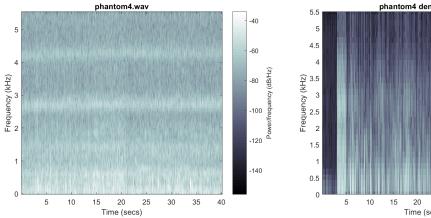


Figure 29: phantom2 file, processed



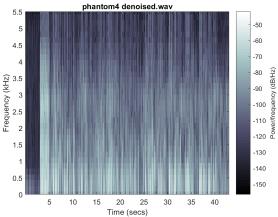


Figure 30: phantom4 file, unprocessed

Figure 31: phantom4 file, processed

B Code

```
enhance_a_new_hope.c
    Type
Text
Size
16 KB (16,678 bytes)
    Storage used
0 bytesOwned by undefined
Location
    Location
project
Owner
Tomasz Bia as
Modified
Mar 20, 2019 by Tomasz Bia as
   DEPARTMENT OF ELECTRICAL AND ELECTRONIC ENGINEERING IMPERIAL COLLEGE LONDON
                           EE 3.19: Real Time Digital Signal Processing
Dr Paul Mitcheson and Daniel Harvey
                                     PROJECT: Frame Processing
                                         ****** ENHANCE. C ******
                            Shell for speech enhancement
              \label{lem:demonstrates} Demonstrates\ overlap\mbox{-add}\ frame\ processing\ (interrupt\ driven)\ on\ the\ DSK.
                             ^{*} You should modify the code so that a speech enhancement project is built ^{*} on top of this template.
40
    /* The file dsk6713.h must be included in every program that uses the BSL. This
   example also includes dsk6713_aic23.h because it uses the
   AIC23 codec module (audio interface). */
#include "dsk6713.h"
#include "dsk6713_aic23.h"
    // math library (trig functions)
#include <math.h>
    /* Some functions to help with Complex algebra and FFT. */ \#include "cmplx.h" \#include "fft_functions.h"
    // Some functions to help with writing/reading the audio ports when using interrupts. 
 \#include < helper_functions_ISR.h>
    #define WINCONST 0.85185 /* 0.46/0.54 for Hamming window */
#define FSAMP 8000.0 /* sample frequency, ensure this matches Config for AIC */
#define FFTLEN 256 /* fft length = frame length 256/8000 = 32 ms*/
#define NFREQ (1+FFTLEN/2) /* number of frequency bins from a real FFT */
#define OVERSAMP 4 /* oversampling ratio (2 or 4) */
```

```
#define FRAMEINC (FFTLEN/OVERSAMP) /* Frame increment */
#define CIRCBUF (FFTLEN+FRAMEINC) /* length of I/O buffers */
     #define OUTGAIN 64000.0 /* Output gain for DAC *

#define INGAIN (1.0/16000.0) /* Input gain for ADC

// PI defined here for use in your code

#define PI 3.141592653589793

#define TFRAME FRAMEING PAGE
                                                        /st time between calculation of each frame st/
     };
     // Codec handle:- a variable used to identify audio interface DSK6713_AIC23_CodecHandle H_Codec;
     *m3, *m4; /* Minimum noise intervals */
/* Magnitude sum of m1*/
/* Magnitude sum of m2*/
/* Magnitude sum of m3*/
/* Magnitude sum of m4*/
     float *noise-pow;
float *lpmag_buf;
float *lppow_buf;
float *mag_buf;
float *pow_buf;
                                          /* Noise power for selected minimum buffer */
/* Magnitude of input after low pass filter buffer*/
/* Power of input after low pass filter buffer*/
/* Magnitude of input buffer*/
/* Power of input buffer*/
117
118
119
120
121
122
123
     complex *resframe0;
complex *resframe1;
complex *resframe2;
                                              /* magnitude buffer of resframe0 */
/* magnitude buffer of resframe1 */
/* magnitude buffer of resframe2 */
     float *resframe0_mag;
float *resframe1_mag;
float *resframe2_mag;
128
129
                                        /st buffer of ones, used to switch easily between noise reductino formulae st/
     float lambda = 0.08;
float alpha = 5.0;
                                              /*scales noise reduction*/
     float time_constant = 0.02;
                                                  /*time constant for low pass filter*/
     float res_thresh = 0.8;
                                                /*residual noise threshold*/
     int frame_count = 0;
int frames_per_interval; /*counter to see when an interval is over*/
    /*number of frames when interval is over*/
     float time_frame = 10.0;
float filter_constant;
                                                /*time interval over which minimum noise is found*/    /*calculated within main, declared here if desired to change manually*/
     /*---switches----*/
     int passthrough = 0;
int filtering = 1;
    filtering */
int g-omega = 5;
int g-pow = 0;
int residual = 0;
                                           /*allows signal through without processing*/    /*switches filtering; 0 = no filtering, 1 = magnitude filtering, 2 = power
                                    /*switches between noise reduction formulae*/
/*turns on noise reduction in power domain*/
/*turns on residual noise reduction*/
     162
163
164
165
                    int\ k; // used in various for loops
166
167
        filter_constant = 0.7; //expf(-TFRAME/time_constant);
     /* Initialize and zero fill arrays */
       inbuffer = (float *) calloc(CIRCBUF, sizeof(float)); /* Input array */
outbuffer = (float *) calloc(CIRCBUF, sizeof(float)); /* Output array */
fftframe = (complex *) calloc(FFTLEN, sizeof(complex));
inwin = (float *) calloc(FFTLEN, sizeof(float)); /* Input window */
outwin = (float *) calloc(FFTLEN, sizeof(float)); /* Output window */
                                                                                                Output window */
        /*minimum noise buffers*/
```

```
= (float *) calloc(FFTLEN, sizeof(float)); /* noise buffer*/
180
181
182
183
184
185
186
187
188
189
190
191
                  /*magnitude and power buffers of noise and signal at various stages*/
                 lpmag_buf = (float *) calloc(FFTLEN, sizeof(float));
lppow_buf = (float *) calloc(FFTLEN, sizeof(float));
mag_buf = (float *) calloc(FFTLEN, sizeof(float)); /* noise buffer*/
pow_buf = (float *) calloc(FFTLEN, sizeof(float)); /* noise buffer*/
noise_pow = (float *) calloc(FFTLEN, sizeof(float));
                 /*residual noise reduction buffers*/
 193
                 resframe0 = (complex *) calloc(FFTLEN, sizeof(complex));
resframe1 = (complex *) calloc(FFTLEN, sizeof(complex));
resframe2 = (complex *) calloc(FFTLEN, sizeof(complex));
196
197
198
199
                 resframe0_mag = (float *) calloc(FFTLEN, sizeof(float));
resframe1_mag = (float *) calloc(FFTLEN, sizeof(float));
resframe2_mag = (float *) calloc(FFTLEN, sizeof(float));
200
201
                 /*{\tt array} \ {\tt of ones used for g\_omega and g\_pow switching to be \ easier*/
                 ones = (float *) calloc(FFTLEN, sizeof(float));
                 /* initialize board and the audio port */ init_hardware();
207
208
209
                               initialize hardware interrupts */
210
211
212
213
214
215
                      init_HWI();
            /* initialize algorithm constants */
                      for (k=0;k<FFTLEN;k++)
216
                {
                      \begin{array}{ll} inwin\left[k\right] &= sqrt\left(\left(1.0\text{-WINCONST*}cos\left(PI*\left(2*k+1\right)/FFTLEN\right)\right)/OVERSAMP\right);\\ outwin\left[k\right] &= inwin\left[k\right];\\ ones\left[k\right] &= 1; \quad //fill \ ones \ with \ ones \end{array}
217
218
219
220
221
222
                       ingain=INGAIN;
outgain=OUTGAIN;
224
                        /* main loop, wait for interrupt */ while(1) process_frame();
           }
                                                                      *********** init_hardware() *********************************
           void init_hardware()
231
232
                                                                the board support library, must be called first
233
                        DSK6713_init();
                       // Start the AIC23 codec using the settings defined above in config \mbox{H\_Codec} = \mbox{DSK6713\_AIC23\_openCodec(0, \&Config);}
                /* Function below sets the number of bits in word used by MSBSP (serial port) for receives from AIC23 (audio port). We are using a 32 bit packet containing two 16 bit numbers hence 32BIT is set for receive */ MCBSP.FSETS(RCR1, RWDLEN1, 32BIT);
238
239
241
242
243
244
245
                 /* Configures interrupt to activate on each consecutive available 32 bits from Audio port hence an interrupt is generated for each L & R sample pair */ MCBSP_FSETS(SPCR1, RINTM, FRM);
246
                         These commands do the same thing as above but applied to data transfers to the
247
                 /* I Hese command as a land a 
 248
                                                                ************** init_HWI() **********************************
255
             void init_HWI(void)
                260
261
262
263
264
265
266
267
268
           }
                                                                                   void process_frame(void)
                int k, m; //iteration variables
int io_ptr0;
float *min_buf; //points to minimum noise buffer
float *process_buf; //points to buffer to be processed
269
                 float *lambda_top; //lambda multipplication numberator for g_omega and g_pow switching float *lambda_bot; //lambda multipplication denominator for g_omega and g_pow switching float *signal_bot; //signal multipplication numberator for g_omega and g_pow switching float *signal_bot; //signal multipplication numberator for g_omega and g_pow switching
                 /* work out fraction of available CPU time used by algo cpufrac = ((float) (io-ptr & (FRAMEINC - 1)))/FRAMEINC;
                  /* wait until io-ptr is at the start of the current frame */ while((io-ptr/FRAMEINC) != frame-ptr);
                 /* then increment the framecount (wrapping if required) */ if (++frame_ptr >= (CIRCBUF/FRAMEINC)) frame_ptr=0;
285
                  /* save a pointer to the position in the I/O buffers (inbuffer/outbuffer) where the data should be read (inbuffer) and saved (outbuffer) for the purpose of processing */io_ptr0=frame_ptr * FRAMEINC;
```

```
/st copy input data from inbuffer into inframe (starting from the pointer position) st/
            \begin{array}{c} m\!\!=\!\!i\,o\,\!_{-}\!p\,t\,r\,0\;;\\ \text{for} \quad (k\!=\!0;k\!<\!\!FFTLEN\,;k\!+\!+\!) \end{array}
             {
                   \begin{array}{lll} fftframe\,[\,k\,]\,.\,\,r\,=\,i\,n\,b\,u\,ffer\,[\,m\,] &*\,i\,n\,w\,i\,n\,[\,k\,]\,;\\ fftfram\,e\,[\,k\,]\,.\,\,i\,=\,0\,;\\ i\,f\,\,(++m\,>=\,CIRCBUF)\,\,m=0\,;\,\,/\,*\,\,wrap\,\,i\,f\,\,required\,\,*/ \end{array} 
296
297
             303
304
              //allows signal if (!passthrough)
                                  signal to pass through unprocessed
305
306
307
308
309
310
                  frame_count++;
                  //magnitude filter
311
                        (filtering == 1)
312
313
                       \begin{array}{ll} \textbf{for} & (\,k\!=\!0\,;k\!<\!\!\text{FFTLEN}\,;\,k\!+\!+) \end{array}
                            \begin{array}{lll} pow\_buf[k] &=& fftframe[k].r*fftframe[k].r+& fftframe[k].i*fftframe[k].i; \\ mag\_buf[k] &=& sqrtf(pow\_buf[k]); \\ lpmag\_buf[k] &=& (1-filter\_constant)*mag\_buf[k]+& filter\_constant*lpmag\_buf[k]; \\ lppow\_buf[k] &=& lpmag\_buf[k]*lpmag\_buf[k]; \\ \end{array} 
318
321
322
323
324
325
                       process_buf = lpmag_buf;
                  //power filter
else if (filtering == 2)
                       \begin{array}{ll} \textbf{for} & (\,k\!=\!0\,;k\!<\!\!\text{FFTLEN}\,;\,k\!+\!+\!) \\ \{ & \end{array}
327
328
                            \begin{array}{lll} pow\_buf[k] &=& fftframe[k].r*fftframe[k].r + fftframe[k].i*fftframe[k].i; \\ mag\_buf[k] &=& sqrtf(pow\_buf[k]); \\ lppow\_buf[k] &=& (1-filter\_constant)*pow\_buf[k] + filter\_constant*lppow\_buf[k]; \\ lpmag\_buf[k] &=& sqrtf(lppow\_buf[k]); \end{array} 
333
                       process_buf = lpmag_buf;
334
335
                  //no filtering *BASELINE*
                      int temp = FFTLEN;
for (k=0; k < temp; k++)
{</pre>
                            \begin{array}{lll} pow\_buf[\,k\,] &=& fftframe\,[\,k\,] \,.\, r*fftframe\,[\,k\,] \,.\, r \,+\, fftframe\,[\,k\,] \,.\, i*fftframe\,[\,k\,] \,.\, i\,; \\ mag\_buf[\,k\,] &=& sqrtf\,(\,pow\_buf\,[\,k\,]\,) \,; \end{array} 
343
344
                      process_buf = mag_buf;
349
                  if (frame_count >= 78)
351
                  /*rotates the minimum noise buffers*/
float *temp = m4;
m4 = m3;
m3 = m2;
m2 = m1;
m1 = temp;
351
352
353
354
355
356
357
358
                       frame_count = 0;
359
360
361
362
363
                      \label{eq:maga} \begin{array}{ll} //\operatorname{shift} & \operatorname{buffer} & \operatorname{magnitude} & \operatorname{sums} \\ \operatorname{mag4} & = \operatorname{mag3}; \\ \operatorname{mag3} & = \operatorname{mag2}; \\ \operatorname{mag2} & = \operatorname{mag1}; \end{array}
364
                       //overwrites m1 with first frame in new interval for (k\!=\!0;k\!<\!\!FFTLEN;k++)
365
366
367
368
369
370
371
372
373
                           m1\,[\,k\,] \ = \ p\,r\,o\,c\,e\,s\,s\,\lrcorner\,b\,u\,f\,[\,k\,]\,;
                      }
                   //updates m1
                      \begin{array}{ll} \textbf{for} & (\,k\!=\!0\,;k\!<\!\!\text{FFTLEN}\,;\,k\!+\!+) \\ \{ \end{array}
                           \begin{array}{lll} if & (m1[\,k\,] \, > \, process\_buf[\,k\,] \,) & m1[\,k\,] \, = \, process\_buf[\,k\,] \,; \end{array}
                     /calculate m1 magnitude sum
                  mag1=0;
                   for (k=0; k<FFTLEN; k++)
381
382
383
384
385
386
387
                      mag1 \ += \ m1 \, [ \ k \ ] \ ;
                  //finds buffer with smallest magnitude sum, points min_buf to that buffer if (mag1 < mag2 && mag1 < mag3 && mag1 < mag4) min_buf = m1; else if (mag2 < mag4) min_buf = m2; else if (mag3 < mag4) min_buf = m3; else if (mag3 < mag4) min_buf = m3; else min_buf = m4;
388
389
390
391
392
393
                  //finds power buffer of that minimum noise buffer for (k=0;k<FFTLEN;k++)
394
395
                      noise_pow[k] = min_buf[k]*min_buf[k];
397
                  //points lambda and signal pointers to relevent buffers depending on g_omega and g_pow if (g_omega == 1)
                      lambda_top = min_buf;
```

```
402
403
404
405
406
                         lambda_bot = mag_buf;
if (g_pow)
                              signal_top = noise_pow;
signal_bot = pow_buf;
                 | cloot = pow_buf;
| else | |
| signal_top = min_buf;
| signal_bot = mag_buf;
| }
| }
407
408
409
410
411
412
413
414
415
                    else if (g_omega == 2)
                  else 11 (b_om_o
{
   lambda_top = lpmag_buf;
   lambda_bot = mag_buf;
   if (g_pow)
   {
      signal_top = noise_pow;
      signal_bot = pow_buf;
}
416
417
417
418
419
420
421
422
423
                            else
424
425
426
427
428
429
                       {
    signal-top = min-buf;
    signal-bot = mag-buf;
}
430
                    else if (g_omega == 3)
432
433
434
435
436
437
                        lambda_top = min_buf;
lambda_bot = lpmag_buf;
if (g_pow)
                              signal_top = noise_pow;
signal_bot = lppow_buf;
438
                       else
439
440
441
442
443
444
445
446
447
448
449
450
451
452
453
                              signal_top = min_buf;
signal_bot = lpmag_buf;
                    else if (g_omega == 4)
{
                        lambda_top = ones;
lambda_bot = ones;
if (g_pow)
{
    signal_top = noise_pow;
    signal_bot = lppow_buf;
}

454
455
456
457
458
459
460
                      else
{
    signal_top = min_buf;
    signal_bot = lpmag_buf;
}
461
463
464
465
466
467
468
                     else if (g_omega == 5)
                   {
    lambda_top = min_buf;
    lambda_bot = ones;
    (z pow)
                        if (g-pow)
                             signal_top = noise_pow;
signal_bot = pow_buf;
469
470
471
472
473
474
475
476
477
478
480
481
482
483
484
485
487
488
489
490
                             signal_top = min_buf;
signal_bot = mag_buf;
                    } '
//default baseline
else
                  else
{
    lambda_top = ones;
    lambda_bot = ones;
    if (g-pow)
    {
        signal_top = noic
                              signal_top = noise_pow;
signal_bot = pow_buf;
                        {
    signal_top = min_buf;
    signal_bot = mag_buf;
491
492
493
                    }
493
494
495
496
497
498
                    //calculates noise reduction in power domain if (g-pow) \,
                          for (k=0;k<FFTLEN;k++)
499
                             float temp = sqrtf(1 - alpha*(signal_top[k]/signal_bot[k]));
float lambda_k = lambda*(lambda_top[k]/lambda_bot[k]);
if (temp < lambda_k) temp = lambda_k;
fftframe[k].r. = fftframe[k].r.*temp;
fftframe[k].i = fftframe[k].i*temp;</pre>
505
506
507
                             //puts processed signal in resframe0 and resframe0_mag if (residual) \,
                                    \begin{array}{lll} resframe0\left[\,k\,\right] & = & fftframe\left[\,k\,\right]\,; \\ resframe0\_mag\left[\,k\,\right] & = & cabs\left(\,fftframe\left[\,k\,\right]\,\right)\,; \end{array}
```

```
//calculates noise reduction in magnitude *BASELINE*
                 \begin{array}{ll} \textbf{for} & (\,k\!=\!0\,;k\!<\!\!\text{FFTLEN}\,;\,k\!+\!+\!) \\ \{ & \end{array}
                     \begin{array}{lll} float & temp = 1 & -alpha*(signal-top[k]/signal-bot[k]); \\ float & lambda_k = lambda*(lambda_top[k]/lambda_bot[k]); \\ if & (temp < lambda_k) & temp = lambda_k; \\ fftframe[k]. & r=fftframe[k]. & r*temp; \\ fftframe[k]. & i = fftframe[k]. & i *temp; \\ \end{array} 
526
                     //puts processed signal in resframe0 and resframe0_mag if (residual) \,
528
529
530
531
532
533
534
535
536
537
549
540
541
542
543
544
545
546
547
                        \begin{array}{lll} resframe0\,[\,k\,] & = & fftframe\,[\,k\,]\,; \\ resframe0\,\_mag\,[\,k\,] & = & cabs\,(\,fftframe\,[\,k\,]\,)\,; \end{array}
                 }
             }
              // calculates and removes residual noise if (residual)
                  complex *temp = resframe2;
                  float *temp_mag = resframe2_mag;
for (k=0;k<FFTLEN;k++)</pre>
                     //checks frequency bin against threshold if (resframe1_mag[k] < res_thresh)
               if (restrame1_mag[n],
{
    //finds minimum in adjacent frames
    if (resframe1_mag[k] < resframe0_mag[k] && resframe1_mag[k] < resframe2_mag[k]) fftframe[k] =
resframe1[k];
else if (resframe2_mag[k] < resframe0_mag[k]) fftframe[k] = resframe2[k];
}</pre>
//rotate residual buffers
resframe2 = resframe1;
resframe1 = resframe0;
resframe0 = temp;
                 resframe2_mag = resframe1_mag;
resframe1_mag = resframe0_mag;
resframe0_mag = temp_mag;
          }
ifft(FFTLEN, fftframe);
          /* multiply outframe by output window and overlap-add into output buffer */
         m=i o p t r 0;
             for (k=0; k<(FFTLEN-FRAMEINC); k++)
                 /* this loop adds into outbuffer */
outbuffer [m] = outbuffer [m]+fftframe [k].r*outwin [k];
(++m >= CIRCBUF) m=0; /* wrap if required */
             i f
          }
             for (; k<FFTLEN; k++)
         {
             outbuffer\,[m]\,=\,fftframe\,[\,k\,]\,.\,r*outwin\,[\,k\,]\,;\qquad/*\ this\ loop\ over-writes\ outbuffer\ */
         }
      // Map this to the appropriate interrupt in the CDB file
      void ISR_AIC(void)
{
          {\bf short} sample; 
 /* Read and write the ADC and DAC using inbuffer and outbuffer */
         sample = mono_read_16Bit();
inbuffer[io_ptr] = ((float)sample)*ingain;
   /* write new output data */
mono_write_16Bit((int)(outbuffer[io_ptr]*outgain));
          /* update io_ptr and check for buffer wraparound */
          if (++io_ptr >= CIRCBUF) io_ptr = 0;
```

References

M Berouti, Richard Schwartz and J Makhoul.
 "Enhancement of speech corrupted by acoustic noise".
 In: [No source information available] 4 (May 1979), pp. 208–211.
 DOI: 10.1109/ICASSP.1979.1170788.

[2] Steven F. Boll. "Suppression of Acoustic Noise in Speech Using Spectral Subtraction". In: Acoustics, Speech and Signal Processing, IEEE Transactions on 27 (May 1979), pp. 113–120. DOI: 10.1109/TASSP.1979.1163209.