

Effect of Wavetable on The Spectral Evolution of Karplus-Strong Synthesized Guitar Notes

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Abstract: *The Karplus-Strong (KS) algorithm is the popular audio synthesis algorithm which synthesizes the sound of a plucked string at low computational complexity. Though it was classified as a wavetable synthesis technique, later it was shown to be a special case of more general physical modeling technique. A plucked string sound is rich in harmonics, slowly loses the higher harmonics and eventually reaches a steady state single tone signal. In this paper a systematic study is carried out to investigate the effect of wavetable on the time evolution of the spectrum of KS generated guitar notes. The results of this study are useful for the synthesis and classification of virtual instruments that use plucked strings, and also in melody extraction from instrumental music.*

Keywords: *guitar notes; plucked string; audio synthesis; fret board; STFT analysis, spectral peak tracking*

I. Introduction

The Karplus–Strong (KS) algorithm is a very low complexity technique for synthesizing the sounds of a plucked string without any justification of the physical processing associated with the plucking a string. When a terminated string of a musical instrument is plucked, it vibrates with high energy producing a complex sound wave. Here complex means having strong and significant number of harmonics. The fundamental frequency of these harmonics is determined mainly by the string mass and tension. Due to air friction the string slowly loses its energy, the magnitude of oscillations gradually reduces; thus the wave becoming lesser complex i.e. with fewer harmonics and smaller amplitudes. As time progresses, all harmonics die leaving only the fundamental mode of oscillations resulting in a pure tone signal, and eventually the vibration of stops, once all the pluck energy is lost [1]. In scenario of a real instrument e.g. guitar, the vibrating string is stopped by finger and the string corresponding to the next note is plucked. Thus in general the waveforms corresponding to the notes of a musical phrase are truncated, except for the last note for which the full decayed waveform can be visualized.

Guitar Fret Board

Each musical instrument uses a standard octave and is normally operated over certain number of octaves above and below the standard octave, based on the pitch range of characteristic sounds that can be produced by the instrument. [2]. A standard acoustic guitar is string based instrument with 6 strings named E, A, D, G, B and \dot{E} in the ascending order of the pitches produced. The pitch is basically determined by the mass and tension of the string. The fingerboard of a guitar has frets i.e. the raised strips of hard material arranged perpendicular to the strings. The frets allows the player stop the string consistently in the same location and with same force, and don't too much dampen the string vibrations as much as fingers alone do. This helps the notes to decay gracefully when the player stops a string in order to end the current note and wishes to start next note. The number of frets varies from instrument to instrument based on the octaves covered and accordingly the cost. The fretboard or fingerboard frequencies of a 20 fret guitar are given in Table 1.

Related Work

The algorithm for synthesizing a plucked string sound was originally proposed by Karplus and Strong [3] and later extended by Jaffe and Smith [4], in which deeper understanding and justification in relation to physical process was provided. In [4,5], the theory of digital waveguides for modeling of acoustic systems, including plucked strings was introduced. Though it was originally proposed as a wavetable synthesis techniques, later it was shown to be physical modeling. Karjalainen et al. [6,7] discussed the bidirectional digital waveguide model of a vibrating string and showed how the extended KS algorithm can be derived from it. They derived a single delay line model from the bidirectional digital delay and showed that it is same as the extended version of KS algorithm. The naturalness of the sound depends on decay rates for the different harmonics. It was shown in [3] that the decay time of the n -th harmonic approximately varies in proportion to p^3/n^2 , where p is the length of the wavetable or the delay line for the 2-point moving average loop filter. This rate changes if the loop filter is changed for example even for a 3-point moving average filter. Moreover, the dependence of decay rates

on the preloaded wavetable was not discussed.

Table 1. Guitar Fretboard frequencies

Fret	String Number (Note)					
	1 (E)	2 (A)	3 (D)	4 (G)	5 (B)	6 (E)
1	82.41	110.00	146.83	196.00	246.94	329.63
2	87.31	116.54	155.56	207.65	261.63	349.23
3	92.50	123.47	164.81	220.00	277.18	369.99
4	98.00	130.81	174.61	233.08	293.66	392.00
5	103.83	138.59	185.00	246.94	311.13	415.30
6	110.00	146.83	196.00	261.63	329.63	440.00
7	116.54	155.56	207.65	277.18	349.23	466.16
8	123.47	164.81	220.00	293.66	369.99	493.88
9	130.81	174.61	233.08	311.13	392.00	523.25
10	138.59	185.00	246.94	329.63	415.30	554.37
11	146.83	196.00	261.63	349.23	440.00	587.33
12	155.56	207.65	277.18	369.99	466.16	622.25
13	164.81	220.00	293.66	392.00	493.88	659.26
14	174.61	233.08	311.13	415.30	523.25	698.46
15	185.00	246.94	329.63	440.00	554.37	739.99
16	196.00	261.63	349.23	466.16	587.33	783.99
17	207.65	277.18	369.99	493.88	622.25	830.61
18	220.00	293.66	392.00	523.25	659.26	880.00
19	233.08	311.13	415.30	554.37	698.46	932.33
20	246.94	329.63	440.00	587.33	739.99	987.77

Though the steady state signal generated by the KS algorithm evolves to be a pure tone of single frequency, the signal at initial stages is a basically transient-like which is rich in harmonics decaying subsequently. No results are available in the literature how exactly the wavetable effects the number of harmonics and their amplitudes during the transient phase. In this study, different waveforms: (1). a DC wave, (2). a sine wave, (3). a sawtooth wave, (4). a linear frequency sweep, (5). a quadratic frequency sweep and (6). a harmonic sinusoid (7). Uniform Random (8). Uniform Random Binary and (9). Gaussian Random are considered as wavetables. The track lengths (i.e. the track duration till the time instant falls below a threshold) of harmonics is investigated.

The second point is about the periodicity of wavetable filling the delay buffer. In general the buffer is initially loaded with a single cycle of a wavetable (one of the above signals). If more than one period of wavetable is used to fill the delay line buffer, what effect it has both on the spectrum evolution and subjective quality of sound. These issues are investigated. The results of this study are useful for the synthesis and classification of virtual instruments that use plucked strings. The results are also useful in melody extraction from guitar music. First the guitar notes of 6 strings and 20 frets are simulated using KS algorithm considering the tone fundamental frequencies of Table 1. The notes are synthesized, filling the delay buffer with different types and periods of wavetables. STFT analysis is carried out on the simulated signals. The effect of wavetable on the spectral evolution (can also be called as timbre) are investigated.

The paper is organized as follows. In section II the basic Karplus-Strong model of a vibrating string and the equivalent single delay line model is presented. In section III the techniques of STFT analysis, the spectrogram and are spectral peak tracking are discussed. Section IV describes the details of simulations and the result analysis. Conclusions of the study and scope of future work are discussed in section V.

II. Karplus-Strong Algorithm

The Karplus-Strong algorithm [3,4] simulates the physical process of a plucked string in steps as explained below:

1. A buffer is initialized with a set of discrete random samples to represent the initial energy the string gets by the plucking.
2. A sample is read out from the buffer sequentially, filtered and stored in the same location from which it was read. In original KS algorithm, a filter that averages the current and previous value was used.
3. The process is repeated until the last sample of the buffer is consumed. At this point the buffer is filled with a new set of random values. If the gain of the filter is less than unity, the maximum amplitude of this new set would be less than that of the previous set. If the filter is low pass, the amplitudes of higher harmonics of new set are reduced compared to those of the previous buffer content.
4. The new contents of the buffer are again modified using the same filter used in steps 2 and 3. The process is continued for the required note duration. Thus if the note is long in time, the decayed waveform can be fully visualized, else a truncated waveform results.

The block diagram of the Karplus-Strong synthesis technique is shown in Fig 1.

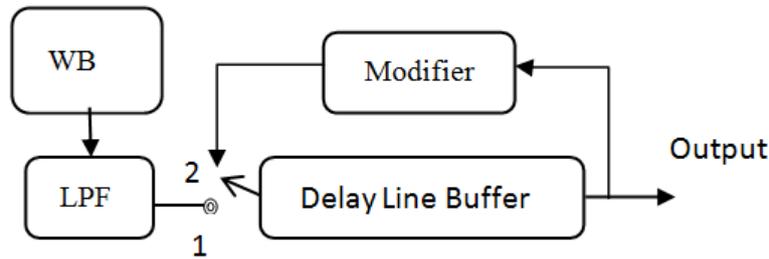


Figure 1. Basic Karplus-Strong plucked string model

Initially the switch is in position 1 and the delay line buffer is loaded with the low pass filtered wideband signal e.g. white noise. The low pass filter essentially band limits the noise. Then the switch is changed to position 2 and the processing of buffer contents starts. The modifier in the feedback loop applies a signal processing operation on the buffer contents, thus continuously modifying the contents based on the type of modifier operation. The signal flow diagram of KS model [3,4,8,9,10] is shown in Fig 2. The loop filter $H(z)$ acts as the modifier which is basically a low pass filter and the L -sample delay block represents the delay buffer of size L samples. The input signal $x(n)$ is basically a sample from delay buffer. With a sampling frequency of F_s , the frequency of the steady state tone is F_s/L which is also the fundamental frequency of the set of harmonics that evolve during the transition phase. It may be noted down that the harmonics evolve due to the comb filtering inherent in the feedback operation around the L -sample delay buffer.

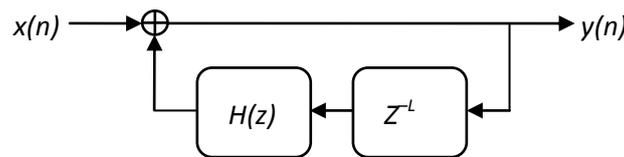


Figure 2. Signal flowgraph of Karplus-Strong algorithm

The original KS string model used a 2-point moving average for loop filter operation. Thus the difference equation for the combined L -sample delay and the loop filter becomes

$$y(n) = x(n) + \frac{y(n-L) + y(n-L-1)}{2} \quad (1)$$

In the extended algorithm [4], a three point moving average filter was proposed. The difference equation for combined L -sample delay and three point average filter is given by

$$y(n) = x(n) + \frac{y(n-L) + 2y(n-L-1) + y(n-L-2)}{4} \quad (2)$$

In this study both filters are used. The magnitude responses of the two loop filters in combination with the L -sample delay are shown in Fig 3 for the delay buffer lengths $L=150$ and $L=71$. For a sampling frequency of 44100Hz, the fundamental frequency (F_s/L) of note generated by KS algorithm is 294Hz (Fig 1a) and 612.13Hz (Fig 1b) respectively. Again for each note, responses of both 2-point and 3-point average filters are plotted in Blue and Red colors respectively. In each case the decay of combs for 3-point filter is faster (red). It may be noted down that the frequencies correspond to the Notes G (8-th fret) and Note \square (12-th fret) respectively. From table, we get the actual frequencies F_1 as 293.66Hz and 622.25Hz respectively. The delay line length L required to generate these tones is F_s/F_1 i.e. 150.1737 and 70.8718 samples respectively. After rounding we get L as 150 and 71 respectively. Then the frequencies (F_s/L) that are generated for these values of L respectively are 294Hz and 621.13Hz as given in Fig 3. In next section we discuss the details of the simulations and the result analysis.

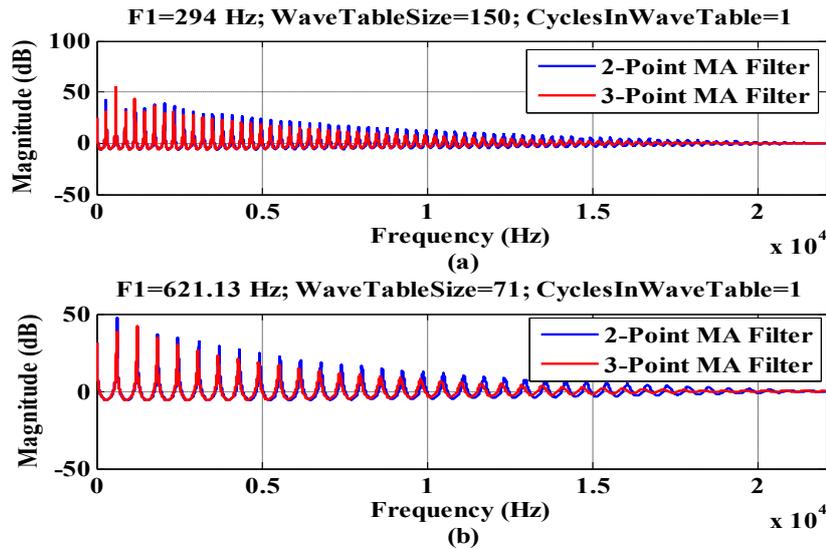


Figure 3. Magnitude Response of the combination of L-sample delay and Loop Filter (a). for Note G and 8-th fret, 293.66 Hz (b). for Note □ and 12-th fret, 622.25Hz.

III. Short Term Spectral Analysis

As the spectral content of KS synthesized sound continuously changes, a short term analysis of the spectrum [11,12] using the short time fourier transform (STFT) is considered. First the input signal $y(n)$ is divided into overlapping frames each of size N , with 50% overlap. Each frame is multiplied by a window function $w(k)$ such as a hamming window of same size N and analyzed by using the Fast Fourier Transform. A matrix S is formed by arranging STFT coefficients as columns. This matrix is popularly known as a *spectrogram* and is given by

$$S(k, l) = \frac{1}{MW_n N} \left| \sum_{n=0}^{N-1} y(n + lM) w(n) e^{-j\frac{2\pi nk}{N}} \right|^2 \quad 0 \leq k \leq K - 1, 0 \leq l \leq L - 1 \quad (3)$$

where k is the frequency index, l is the time frame index, M is the hop size, K is the total number of frequency bins of ones-sided STFT, L is the total number of frames contained in the signal and W_n is the window energy, used to normalize the window function $w(n)$

Spectral Peak Detection And Tracking

A peak detection algorithm [13] is applied on each column of the *spectrogram* matrix S . A quadratic interpolation algorithm [14] is used for the accurate estimation of peak location. All the peaks in *spectrogram* whose amplitude is greater than a threshold (*globalTH*) are considered significant. The peaks in successive columns are generally correlated and hence, connectivity of these peaks is established using the constraints:

1. The shift of a peak from i -th column to $(i+1)$ -st cannot be more than Δ Hz.
2. The amplitude change of a peak from i -th column to $(i+1)$ -st cannot be more than A step dB.

If any of the previously found peaks does not satisfy the above constraints, the track is terminated in the current frame. If a new peak that is not in the previously found list appears in the current frame, a new track is initiated. Thus the trajectories of the spectral peaks are constructed and are later used for overlaying the tracks as line plots on the *spectrogram* display

IV. Simulations And Result Analysis

The Karplus-Strong algorithm shown in Figs 1 and 2 was implemented loading one or more cycles of different wavetables, one at a time. The simulations are carried out in MATLAB environment using customized programs except for the built-in functions: $filter(b, a, x)$ and $FFT(x, nfft)$.

The wavetables used are (1). Sinusoid (F_1) (2). Constant (DC) (3). Uniform Random $U(-1,1)$ (4). Gaussian Random $N(0,1)$ (5). Uniform Random Binary: $U(-1$ or $1)$ (6). Linear Chirp: (100Hz - 22050Hz) (7). Quadratic Chirp: (100Hz-22050Hz) (8). Sawtooth (F_1) and (9). Harmonic Sinusoid (F_1). All these waveforms are self-explanatory and of unit amplitude except for Gaussian noise, which has zero mean and unity variance.

In this case, most of the values are within $\mu \pm 3\sigma$ range i.e. $[-3, 3]$. Hence, the Gaussian noise is normalized with respect to maximum value to fall within the range $[-1,1]$. The Harmonic Sinusoid is another wideband source which comprises the fundamental frequency F_1 and all its harmonics between 0 and $F_1/2$ Hz. The guitar notes are simulated using KS algorithm for all 6 strings: E,A,D,G,B and \dot{E} , and for 20 frets for each string, thus making a total of 120 cases (120 entries in Table 1). For each of this case (i.e. note frequency), 9 different wavetables and for each wavetable again both 2-coefficient and 3- coefficient loop filters are used in synthesis. Thus a total of $120 \times 9 \times 2 = 2160$ signals are synthesized. In what follows the results of selective signals are presented. It is observed that the harmonics decay faster for 3-coefficient filter comparing to 2-coefficient filter. It is expected as the frequency response falls of combs observed in the Fig 3. Results are shown for 3-coefficient loop filter only. The generated tones are also played using Matlab's `soundsc()` function to see the perceptual quality of the note sounds.

Single period of U(-1,1) Wavetable

Fig 4 shows synthesized signal and its spectrogram for Note \square and 12-th fret. The note frequency F_1 from Table 1 is 622.25Hz, which requires L of 70.8718 samples. which is taken as 71. Thus the actual frequency generated would be 621.13 Hz. A wavetable U(-1,1) of uniformly distributed random numbers between -1 and 1 is used. The wavetable has a length 71 samples i.e. one period fitting into the total delay line buffer. There are 13 harmonics between the 0 and 8000Hz with varying amplitudes. The amplitudes of all harmonics are large initially and decays as time progresses. The fundamental has the largest initial amplitude and continue to sustain during the total duration of 2 seconds, though its amplitude decays. However, all other harmonics decay faster than the amplitude of the fundamental. As the harmonic number increases the decay is also fast. This can be seen in Fig 4b, as brighter green/red lines on the blue background of the spectrogram. Except the fundamental, which survives the total duration, all other harmonics die eventually. (please see the green lines).

Single period of Sawtooth Wavetable

Fig 5. shows synthesized signal and its spectrogram for Note G and 8-th fret using a sawtooth wavetable. The note frequency F_1 from Table 1 is 293.66Hz, which requires L of 150.1737 samples taken as 150 after rounding. Thus the actual frequency generated would be 294Hz. Here the fundamental also decays to zero level after 1 second, whereas the higher harmonics decay much faster. It mat also be noted that the spacing between successive green/red traces is half that observed in Fig 4, because the fundamental 294Hz is approximately half of 621.13Hz of Fig 4b.

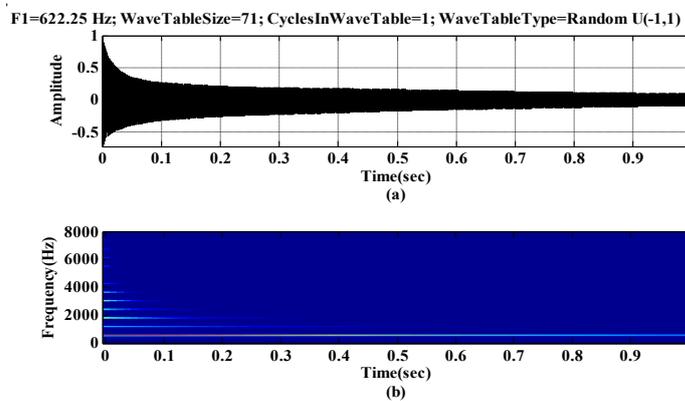


Figure 4. (a). KS generated Waveform of Note \square and 12-th fret (b). Its Spectrogram.

Multiple periods of U(-1,1) Wavetable

In this section the results are presented for the case where the delay line buffer is loaded with the multiple periods of a wavetable. Fig 6 shows the the spectrogram of the KS generated signal for Note \square and 12-th fret i.e. for note frequency 622.25Hz. The actual frequency generated for the wavetable length of 71 samples would be would be 621.13 Hz as discussed earlier. In this case 2.4 periods of a shorter wavetable is stuffed into the delay line buffer of length 71 samples. The length of the shorter wavetable is $71/2.4 \approx 30$ samples. The buffer now contains 2 full periods (60 samples) and another 11 samples from the third period.

Fig 7 shows the the spectrogram of the KS generated signal for Note \square (12-th fret) but this time filling full 3 periods of wavetable filling the delay buffer of 71 samples. Similarly Fig 8 shows the the spectrogram of the KS generated signal for Note G (8-th fret); 8 periods of wavetable filling the delay buffer.

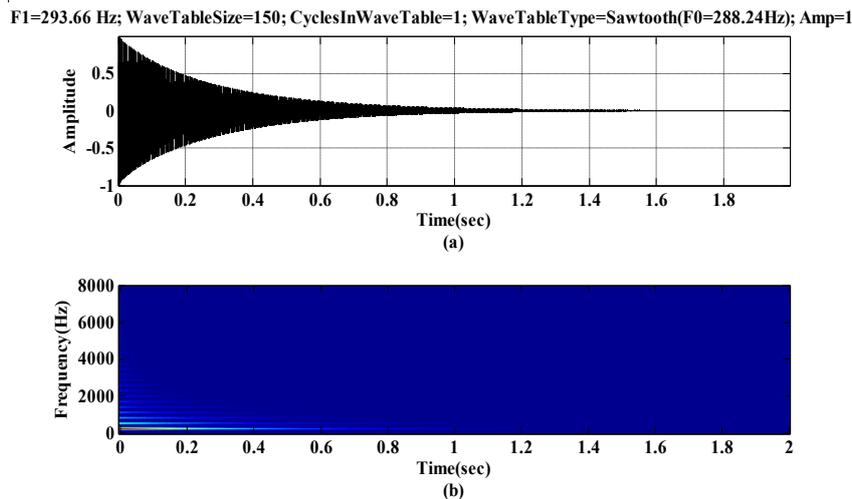


Figure 5. (a). KS generated Waveform of Note **G** and 8-th fret (b). Its Spectrogram for sawtooth wave.

In all three cases, it is observed that the higher harmonics attained larger amplitudes than the fundamental during the transition duration. In steady state, however, only fundamental sustained but with lesser amplitude compared to the case of single period of wavetable filling the buffer. Thus the sounds perceptually resembled those of the higher notes, based on the fact that which harmonic has the maximum strength, which again depends upon the number of periods used in the wavetable. The synthesized note sound is subjectively compared to the sound of the real guitar note in each case. Thus it appears that the conjecture of filling the buffer with multiple copies of shorter wavetables [3,4] does not work, as it is changing the tone quality which is not acceptable.

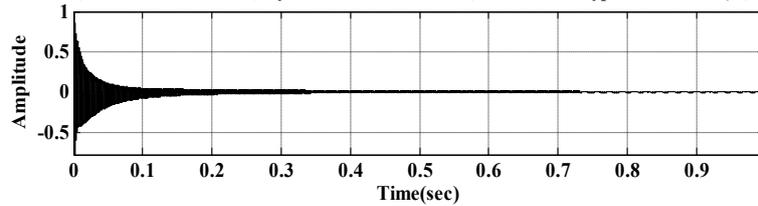
Spectral Evolution of KS synthesized Note \dot{E} for one cycle of a Wavetable

In this subsection, the results of the evolution of short term spectrum over time of a guitar note are presented.. Fig 9 through Fig 13 show the gray scale spectrogram of the KS synthesized signal string \dot{E} 8th fret with fundamental frequency of 493.88 Hz. The spectral peak tracks are overlaid as thick lines above the spectral peaks (black in color). The track length or duration is computed from 0 seconds to the time instant at which the peak amplitude falls below a threshold, here 0.01% of the global maximum of the spectrogram i.e. 40dB below the global maximum. The frequency location and amplitudes of the spectral peaks are obtained as described in section III. Fig 9 displays the gray scale spectrogram of the synthesized Note \dot{E} (8-th fret) signal for single period of a Sinusoid wavetable. The significant spectral peaks are tracked and the tracks are plotted as thick continuous lines overlaid on the spectrogram in fig 9a. There are peaks at seven frequencies at 466Hz, 511Hz, 613Hz, 714Hz, 759Hz, 1225Hz and 1837Hz. These peaks extend for durations of 232ms, 1219ms, 1985ms, 1219ms, 232ms, 360ms and 104ms respectively. Out of these 466Hz, 511Hz, 714Hz, 759Hz tracks are artefacts around the main peak 613Hz and automatically discarded using the properties of symmetry and equal durations around the longer main track. Finally peaks at three frequencies 613Hz, 1225Hz and 1837Hz are taken as the valid tracks. Similar stray tracks are observed for the wavetables: Uniform Random U(-1,1), Quadratic Chirp, Sawtooth and Harmonic Sinusoids. The lengths (durations) of the valid tracks are plotted for the Note \dot{E} (8-th fret) for one period of nine different wavetables in Fig 14. For all wavetables, the longest track is acquired by the fundamental frequency only. The number of harmonics including the fundamental are the lowest i.e. 3 for Sinusoid wavetable. The 7th harmonic i.e. 4287Hz if exists has maximum length of 58ms for Uniform Random Binary wavetable and is the smallest i.e. 4ms for Gaussian Random wavetable. Thus it is observed that the number of significant the harmonics are strongly dependent on (i). the wavetable and (ii). the number of cycles of wavetable filling the delay buffer..

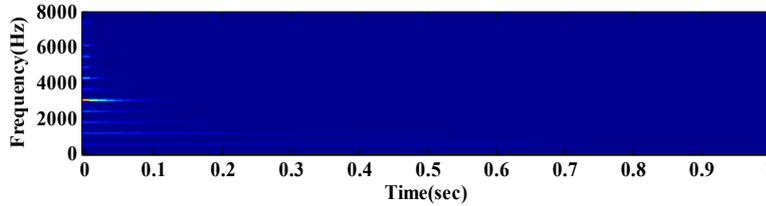
V. Conclusions And Future Work

In this study different waveforms starting from a simple DC signal to complex signals like a quadratic frequency sweep and a harmonic sinusoid are considered as wavetables for synthesizing guitar notes using Karplus-Strong (KS) algorithm. The lengths (durations) of fundamental and its harmonics are computed from the spectrogram. It has been investigated how the type and periodicity of wavetable effects the spectrum evolution over time i.e. track durations. The subjective quality of the note sound produced is assessed compared to the sound of the real guitar note sound.

F1=622.25 Hz; WaveTableSize=71; CyclesInWaveTable=2.4; WaveTableType=Random U(-1,1)



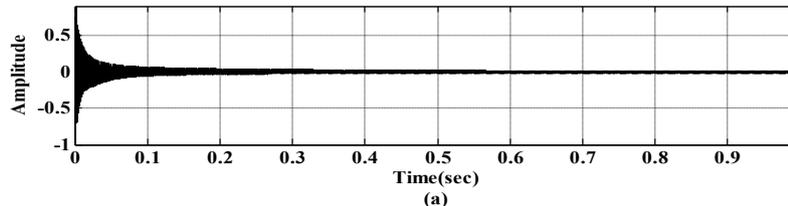
(a)



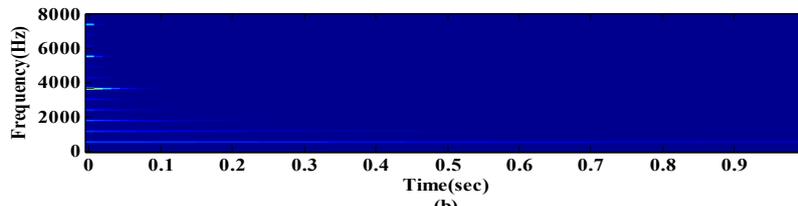
(b)

Figure 6. The spectrogram of the KS generated signal for Note \square and 12-th fret; (2.4 periods of wavetable).

F1=622.25 Hz; WaveTableSize=71; CyclesInWaveTable=3; WaveTableType=Random U(-1,1)



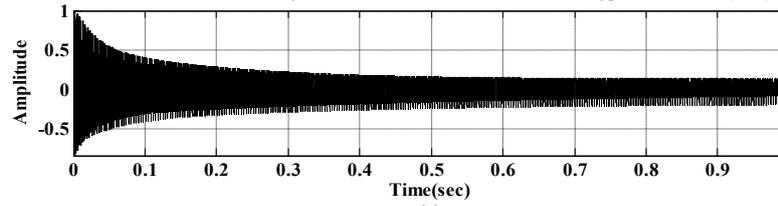
(a)



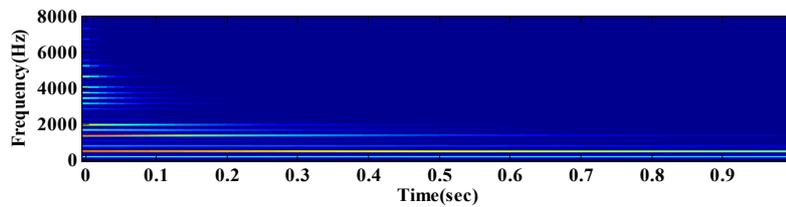
(b)

Figure 7. The spectrogram of the KS generated signal for Note \square and 12-th fret (3 periods of wavetable 3)

F1=293.66 Hz; WaveTableSize=150; CyclesInWaveTable=1.8; WaveTableType=Random U(-1,1)



(a)



(b)

Figure 8. The spectrogram of the KS generated signal for Note **G** and 8-th fret; (1.8 periods of wavetable)

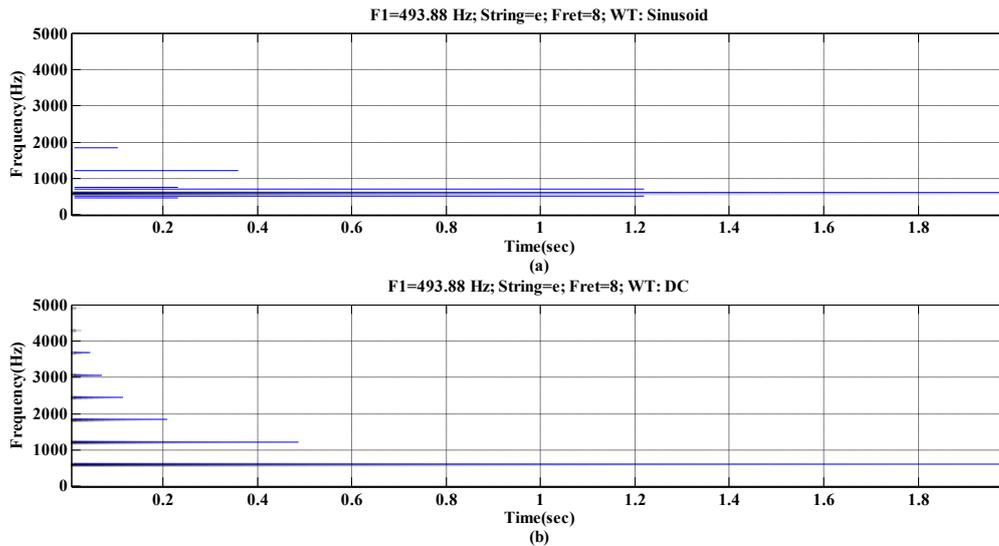


Figure 9. The spectrogram of the KS generated signal for Note \dot{E} and 8-th fret; 1.0 period of (a). wavetable-Sinusoid (b). wavetable-DC

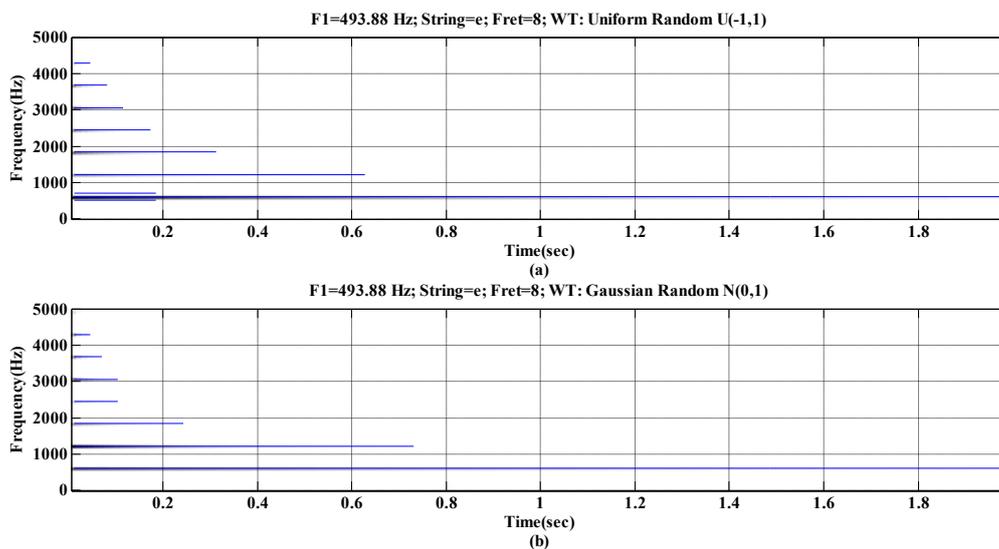


Figure 10. The spectrogram of the KS generated signal for Note \dot{E} and 8-th fret; 1.0 period of (a). wavetable-Uniform Random (b). wavetable- Gaussian Random

The number of significant the harmonics is strongly dependent on type and periods of the wavetable used to initialize the buffer. In case, multiple cycles of a waveform are used as wavetable, some of the higher harmonics attained larger amplitudes than the fundamental, and hence their track durations are higher than that of the fundamental. In this case, perceptually the generated note resembled relatively a higher note. Again which harmonic gets higher amplitude is dependent on the number of periods in the wavetable. Thus the conjecture of filling the buffer with multiple copies of shorter wavetables for synthesizing a note using KS algorithm does not work.

Work is in progress to quantify the decay rates of harmonics for different wavetable signals and for the buffer containing multiple periods of a given wavetable. The results of this study are useful for the synthesis and classification of virtual string instruments. Use of shorter wavetables emulating the longer buffers may reduce the size of physical memory, if a means of controlling the amplitudes of higher harmonics is devised.

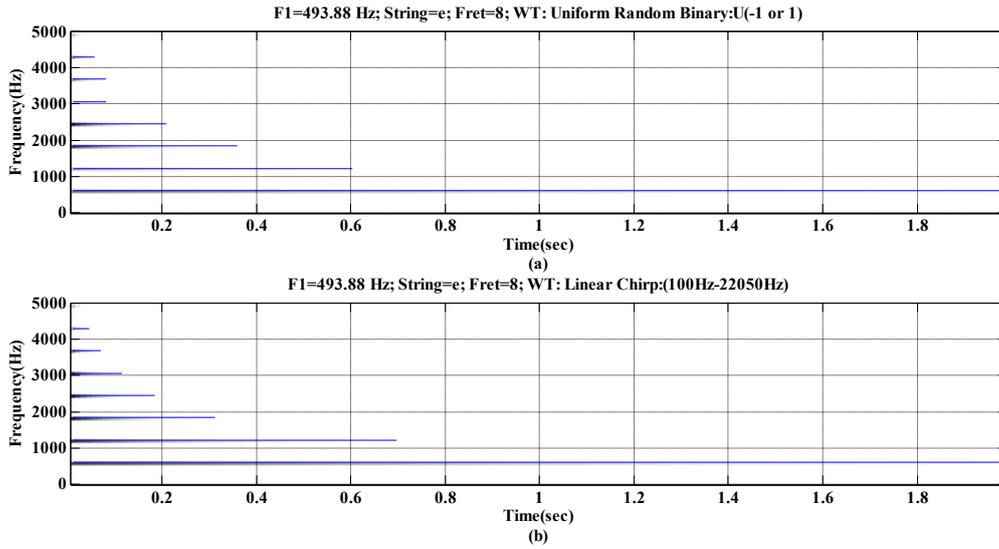


Figure 11. The spectrogram of the KS generated signal for Note \dot{E} and 8-th fret; 1.0 period of (a). wavetable- Uniform Random Binary (b). wavetable- Linear Chirp: (100Hz - 22050Hz)

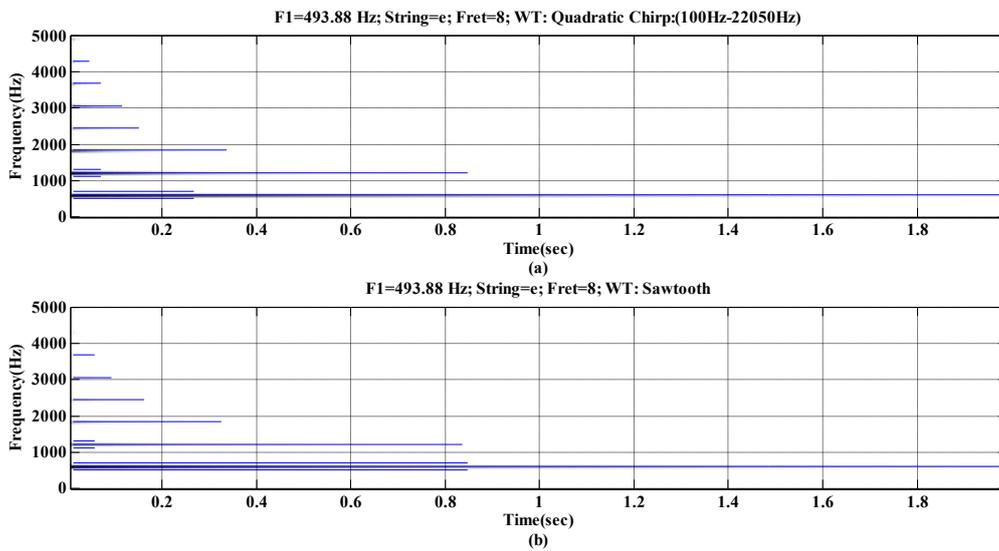


Figure 12. The spectrogram of the KS generated signal for Note \dot{E} and 8-th fret; 1.0 period of(a). wavetable- Quadratic Chirp: (100Hz-22050Hz) (b). wavetable- Sawtooth (F_I)

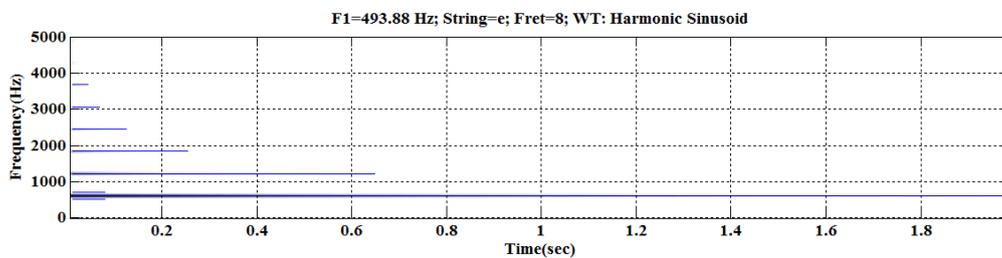


Figure 13. The spectrogram of the KS generated signal for Note \dot{E} and 8-th fret; 1.0 period of Harmonic Sinusoid (F_I)

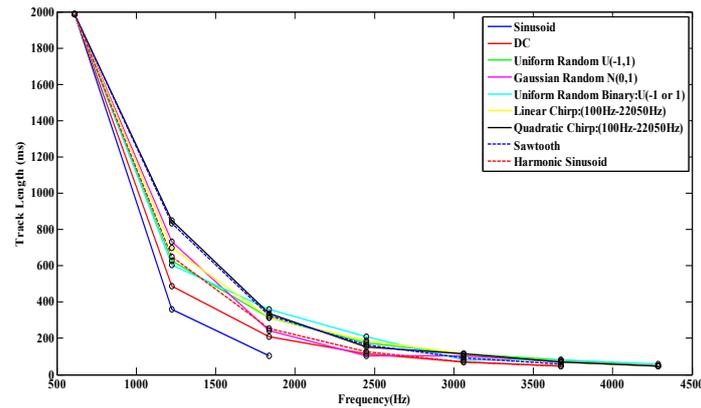


Figure 13. The Track lengths for the KS generated signal for Note E and 8-th fret; 1.0 period of different wavetables

Table 2. Estimated Frequencies and their Track Durations for KS simulated Notes for $F_1=493.88$ Hz; String=e; Fret=8.

WT: Sinusoid (F_1) Amp=1		Constant: Amp=1		Uniform Random U(-1,1)		Gaussian Random N(0,1)		Uniform Random Binary:U(-1 or 1)	
Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)
613	1985	613	1985	612	1985	612	171	612	1985
1225	360	1225	488	1225	627	1225	63	1225	604
1837	104	1837	209	1838	313	1838	21	1838	360
		2450	116	2450	174	2450	9	2450	209
		3062	70	3062	116	3062	9	3062	81
		3675	46	3675	81	3675	6	3675	81
				4287	46	4287	4	4287	58
Linear Chirp: (100Hz - 22050Hz), Amp=1		Quadratic Chirp: (100Hz- 22050Hz), Amp=1		Sawtooth (F_1); Amp=1		Harmonic Sinusoid (F_1); Amp=1			
Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)	Estimated Harmonic Frequency (Hz)	Frequency Track Length (ms)		
613	1985	613	1985	613	1985	613	1985		
1225	697	1225	848	1225	836	1225	650		
1837	313	1837	337	1837	325	1837	255		
2450	186	2450	151	2450	163	2450	128		
3062	116	3062	116	3062	93	3062	70		
3675	70	3675	70	3675	58	3675	46		
4287	46	4287	46						

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