

# Audio Transport

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## Abstract

yoyoyo.

## 1 Introduction

## 2 Contributions

I developed an algorithm that

- techniques to reconstruct an audio signal

- I use a new technique to segment the spectrum into smaller pieces. Phase reconstruction

- I also implemented the algorithm in real-time to

## 3 Related Work

Vocoders existed in the 70's. vocoders take a monophonic source and spread it out over a range of pitches. requires harmonic similarity between the sources. Voices have lots of noise so it is easy - Daft punk.

realtime pitch shifting has become very popular in software and hardware. since the early 2000's. Traditional pitch shifters were granular. Updates to algorithms use phase vocoders.

Real time pitch shifting is a key element to autotune, which characterized the music of the mid 2000's and is still popular today.

Harmonizers sound similar to vocoders. Take a pitch and pitch shift it into new chords.

In 2008 Melodyne pitch shifts individual elements without distorting the sound. They must be processed beforehand and then can be manipulated in realtime

The 2012 product can manipulate polyphonic audio in realtime. <http://www.zynaptiq.com/pitch>

Most of this work has been proprietary and out of research.

So far as I can

processing but no synthesis. [http://www.maths.lu.se/fileadmin/maths/personal\\_staff/Andreas\\_Jakobsson/ElvanderAKJ16\\_icassp\\_final.pdf](http://www.maths.lu.se/fileadmin/maths/personal_staff/Andreas_Jakobsson/ElvanderAKJ16_icassp_final.pdf)

<http://remi.flamary.com/biblio/flamary2016optimal.pdf>

## 4 Optimal Transport

Discussion of optimal transport.

Distance.

It also allows for you to interpolate between the two shapes along the trajectory.

In 1 dimension it is a solved problem.

For any dimensionality higher than 1, fast computation of the wasserstein2 distance is

Optimal transport is however only defined for, nonnegative masses. Audio has phase. Initial attempts to tackle the problem of phase involved formulating the transport problem differently. But you can't hear the distance between two sinusoids that are played at the same pitch but at different phases But you can hear the "distance" between two pitches.

## 5 Phase Vocoder

As noted by, audio quality is .

Vertical and horizontal incoherence.

## 6 Algorithm Overview

### 6.1 STFT

Like almost all spectral algorithms, this one begins with a short-time Fourier transform (STFT) and ends with it's inverse (ISTFT). At the cost of reduced

temporal resolution, the STFT gives us access to the spectral contents of the signal in time.

The STFT fourier transform performs a discrete time Fourier transforms on windows of size  $M$  of the original signal  $x(n)$ . These windows are separated by a hop size of  $R$ . The  $m$ th frame of the STFT is

$$X_m(\omega) = \sum_{n=-\frac{M-1}{2}}^{\frac{M-1}{2}} x_m(n)w(n)e^{-i\omega n} \quad (1)$$

$x_m(n) = x(n + mR)$  is a buffer of size  $M$  of the original signal shifted  $R$  samples from the previous buffer.  $w(n)$  is the synthesis window of size  $M$ .

The ISTFT can then reconstruct the original signal by

In the absence of spectral modifications, we can achieve perfect reconstruction of a signal given that the synthesis and analysis windows obey

$$\sum_m w(n - mR)f(n - mR) = 1, \forall n \in \mathbb{Z} \quad (2)$$

I chose to use the root Hann window, which gives perfect reconstruction when  $R = \frac{M}{2k}$  for  $k \in \mathbb{Z}$ .

$$w(n) = \cos(\pi n/M), n \in \left[-\frac{M-1}{2}, \frac{M-1}{2}\right]$$

## 6.2 Spectrum Segmentation

In order to fix the spec Techniques mention peak finding. However peak finding does not give a great sense of where to put boundaries. The reassigned frequency can be computed by:

$$\hat{\omega}(\omega) = \omega + \Im \left\{ \frac{X_{\mathcal{D}}(\omega) \cdot X^*(\omega)}{|X(\omega)|^2} \right\} \quad (3)$$

where  $X_{\mathcal{D}}$  is the spectrum of the  $x$  with the window  $w_{\mathcal{D}}(n) = \frac{d}{dt}w(n)$ :

$$X_{\mathcal{D}}(\omega) = \text{FFT}(w_{\mathcal{D}}(n)x(n)) \quad (4)$$

d(root hann window)

$$w_{\mathcal{D}}(n) = -\frac{\pi f_s}{M} \sin\left(\frac{\pi n}{M}\right)$$

Nice plot.

## 6.3 Phase Accumulation

Horizontal coherence.

$$\theta' = \theta + \frac{M}{f_s} \hat{\omega}$$

## 6.4 Transport

Combinations of frequencies: rotating in the same direction

$$X_{01}(\omega) = X_0(\omega)^{1-k} X_1(\omega)^k \quad (5)$$

This maintains that the energy of the signal is constant and that the phase rotates from one state to the other. However, this rotation can happen in multiple directions:

## 7 Implementation

Real time. `fftw`

`portaudio` `portmidi`

video

github link

## 8 Conclusion

## 9 References

Fundamental theory

that phase vocoder one

1d transport paper?

STFT

weighted overlap add

`fftw`

`portaudio`

`portmidi`

cite justin solomon