



# WriteHear

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# Overview



- I. What is WriteHear?
  - A. Concept
  - B. How it works
    - 1. Software
    - 2. Hardware
- II. Testing and analysis
  - A. Hardware
  - B. Software



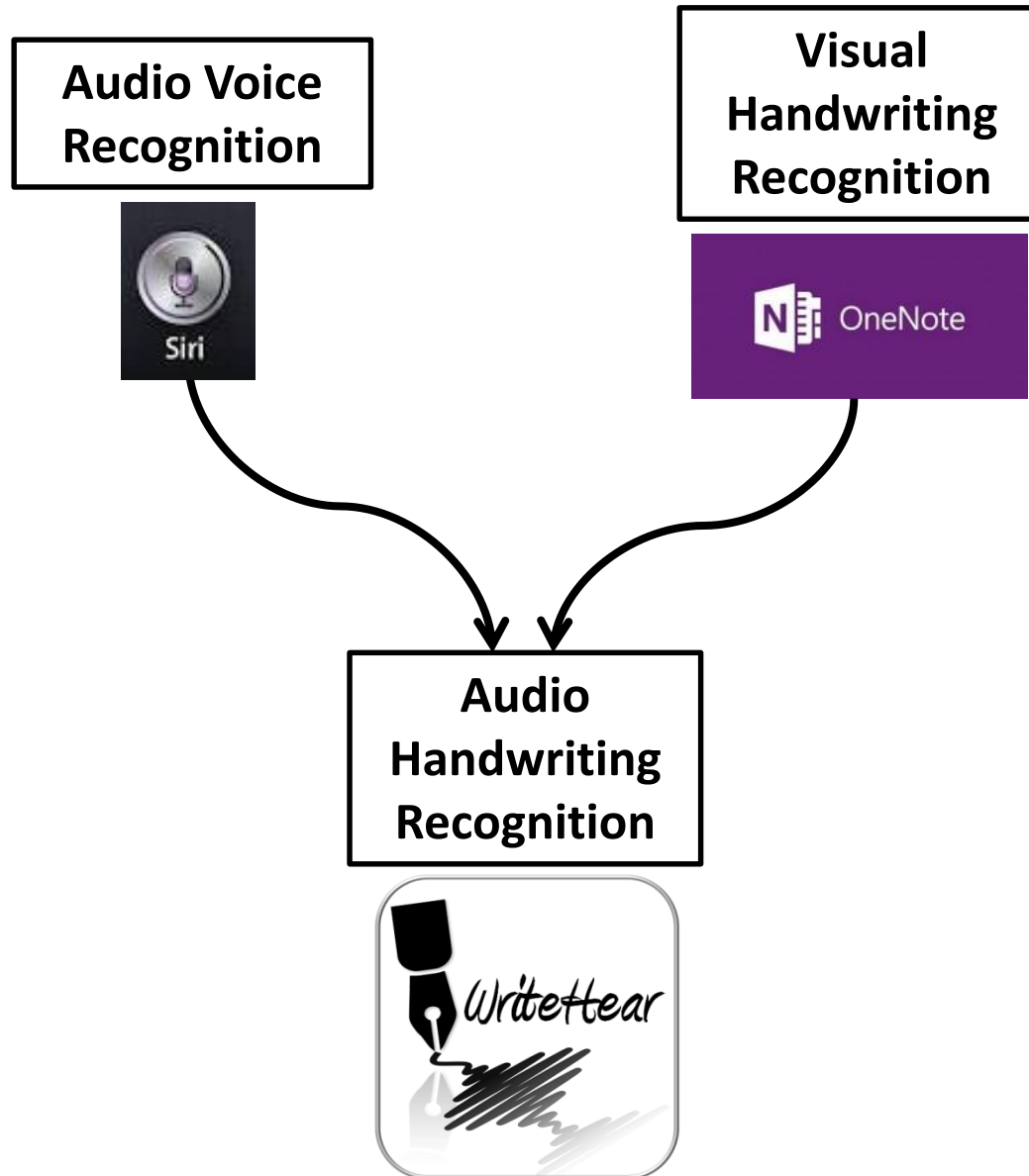


# What is WriteHear?





# Concept





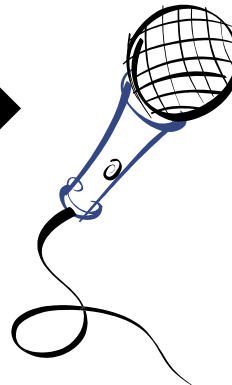
# Concept



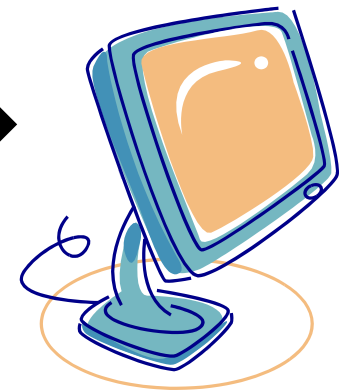
**Sounds produced by  
handwriting**



**Recorded by  
microphone**



**Transcribed by  
software**





# Motivation



Using audio alone:

- Transcribe handwriting
- Verify signatures
- Send encrypted messages





# Past Research



## Sketch Recognition Lab at Texas A&M

### Did Not

- Continuous character recognition
- Noise reduction
- Test various sets of characters
- Test different hardware setups
- Signature verification

### Did

- Distinguish between uppercase characters with %86.8 accuracy

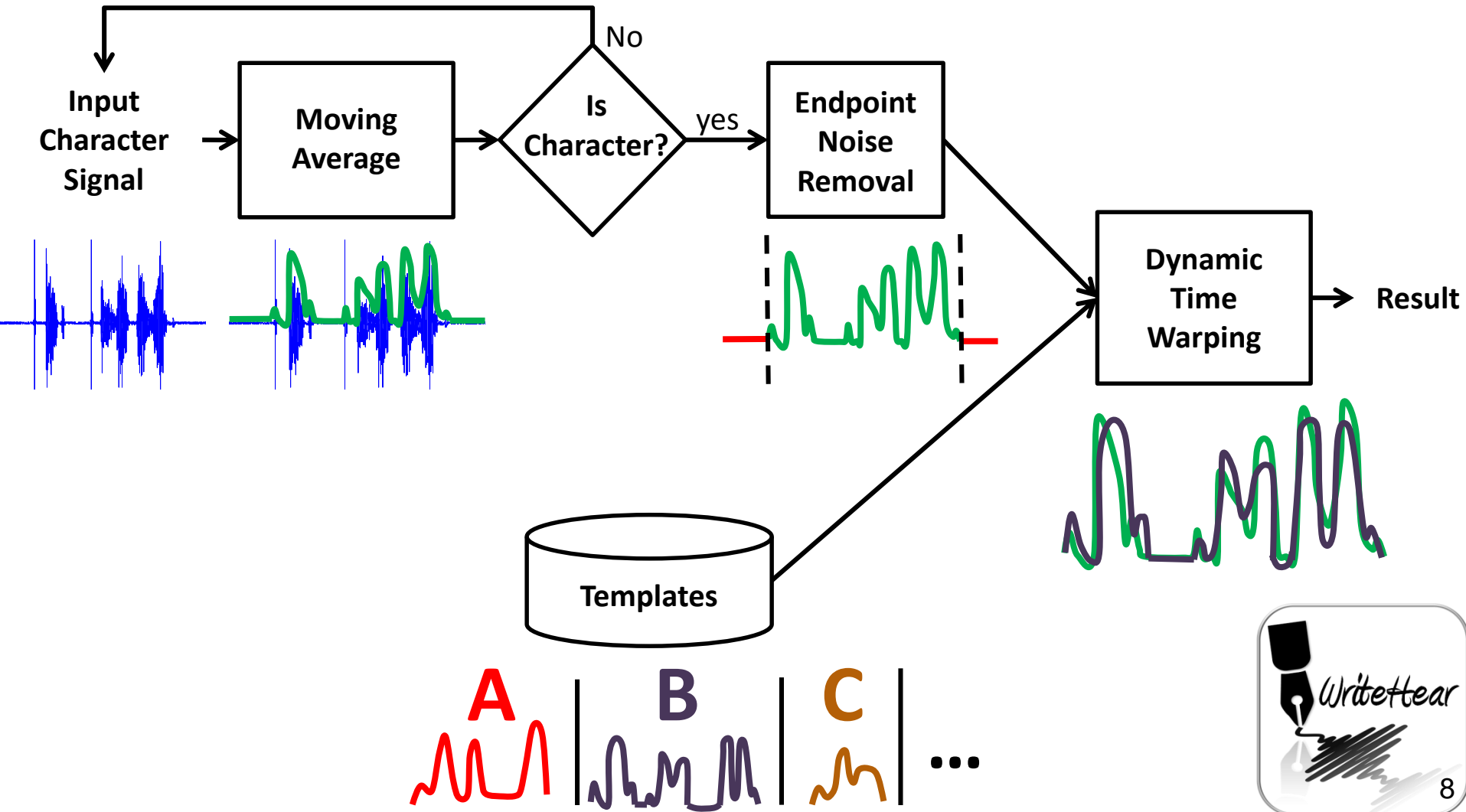




# Software



## System Architecture

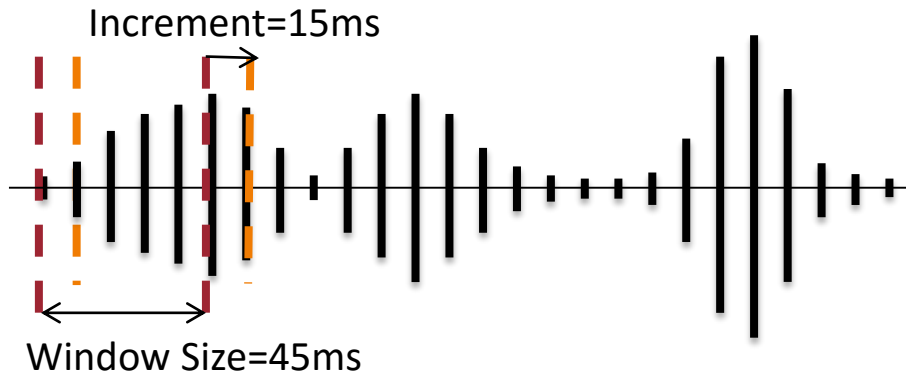




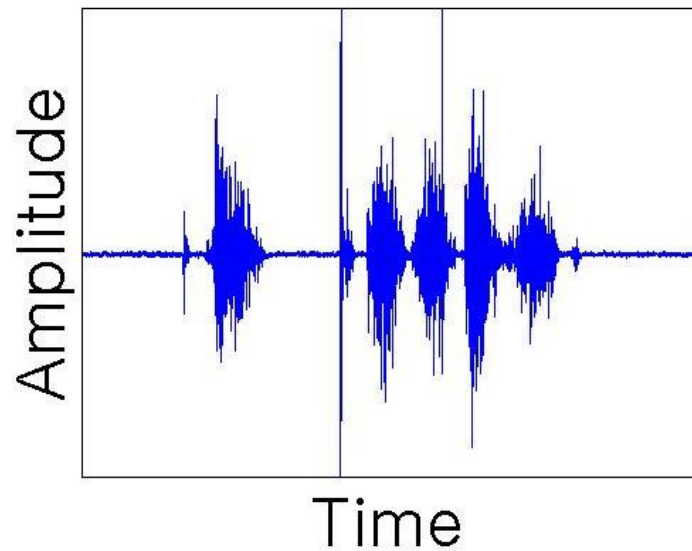


# Software

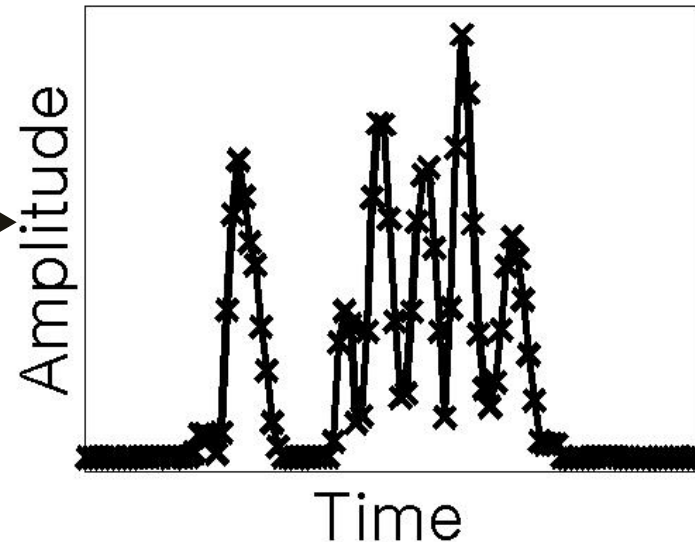
## Moving Average



Input Signal



Moving Average





# Software

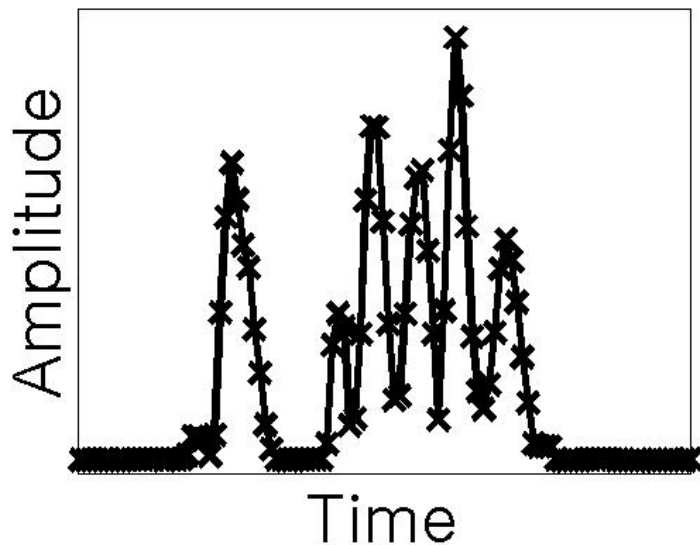
## Endpoint Noise Removal

$$E = \text{signal energy} = \frac{1}{n} \sum_{i=1}^n S_i^2$$

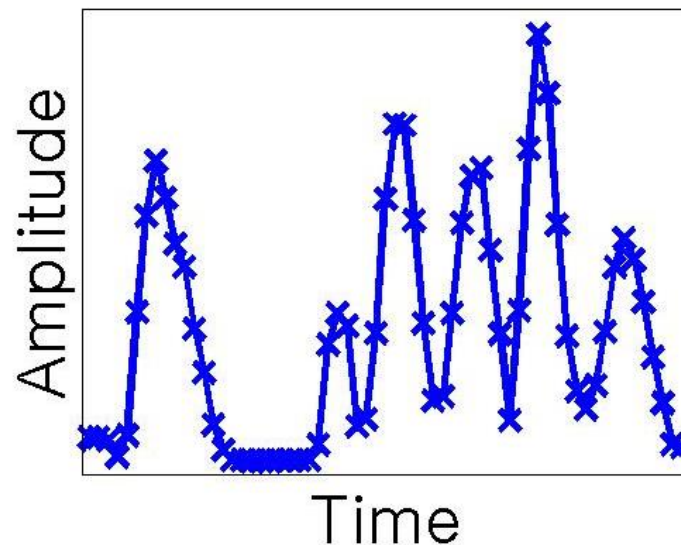
$$E_{\text{character}} > T \times E_{\text{noise}}$$

T is a fixed threshold

### Moving Average



### Noise Removal



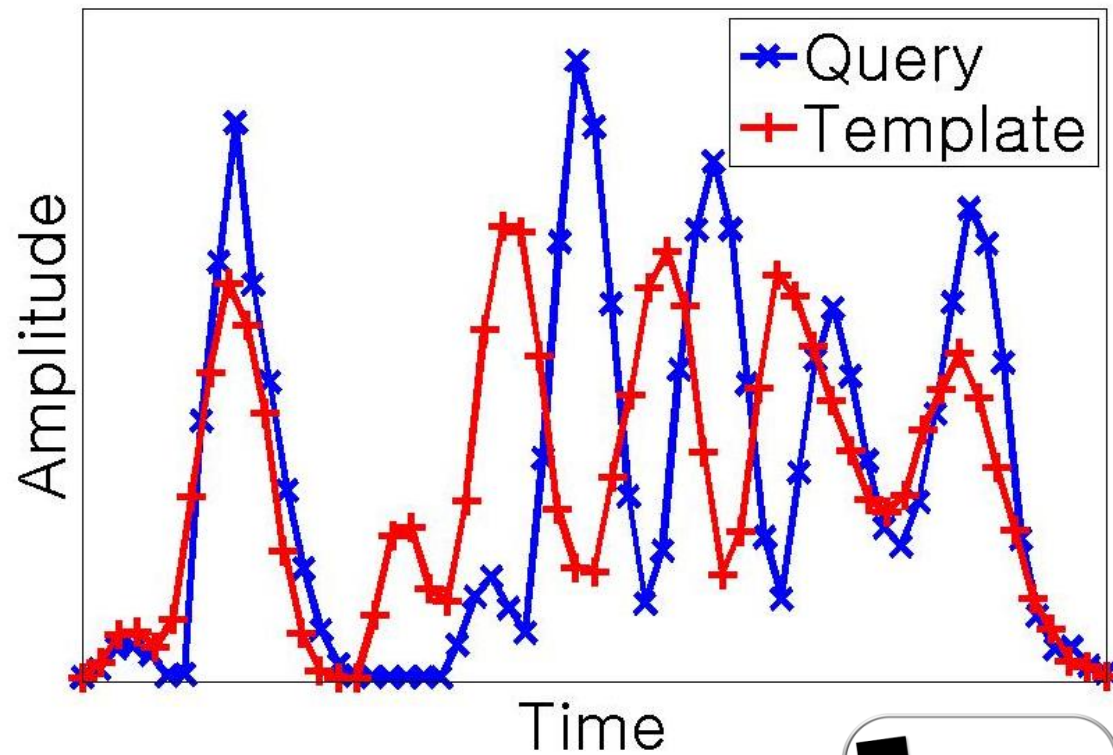


# Software

## Dynamic Time Warping

Method for Comparison:

- Stretches signal along time axis
- Independent of signal length



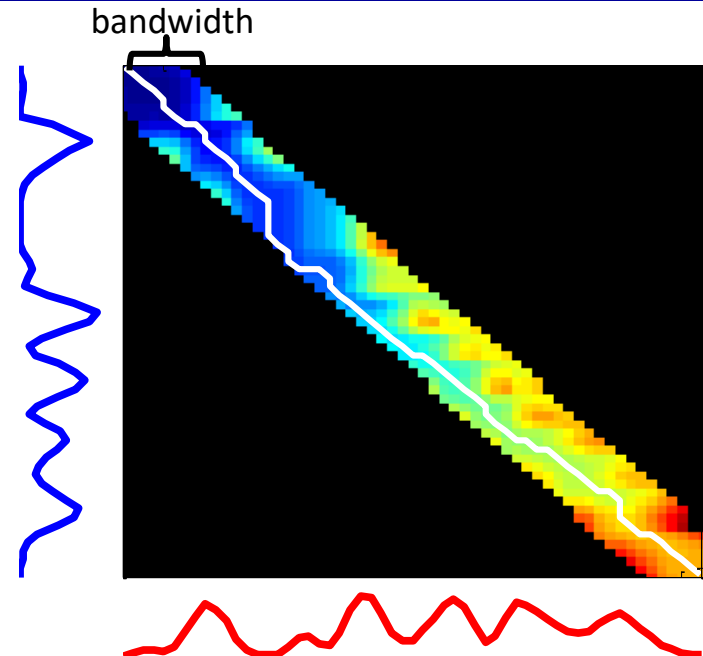
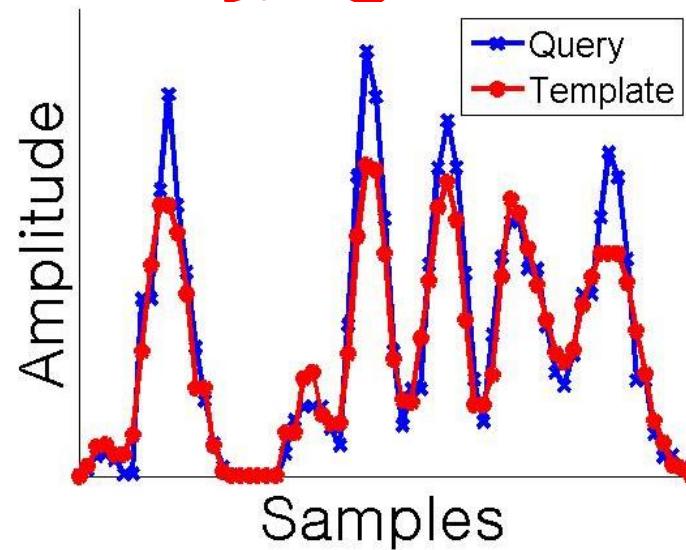
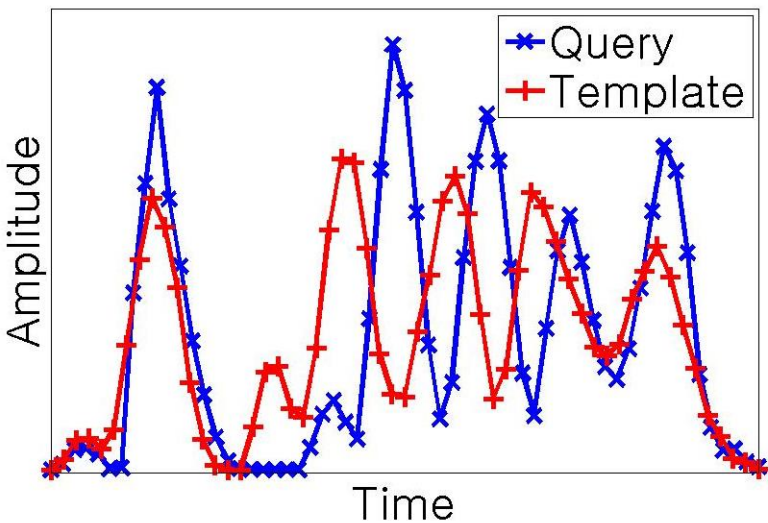


# Software

## Dynamic Time Warping

- Sakoe-Chiba band width of 8% used to restrict warping and maximize accuracy
- Square root of the signals are used for comparison to maximize accuracy


\*see appendix for details





# Software





jesse

Select User

Enter

Test Audio

Settings

Help

Writetear

Start

Teach Me

X

4

+

-

Listening For

abcdefghijklmnp  
qrstuvwxyz

Plot

Clear

Dictionary

☒ Spell Check

+

-

View

Reset

Clear

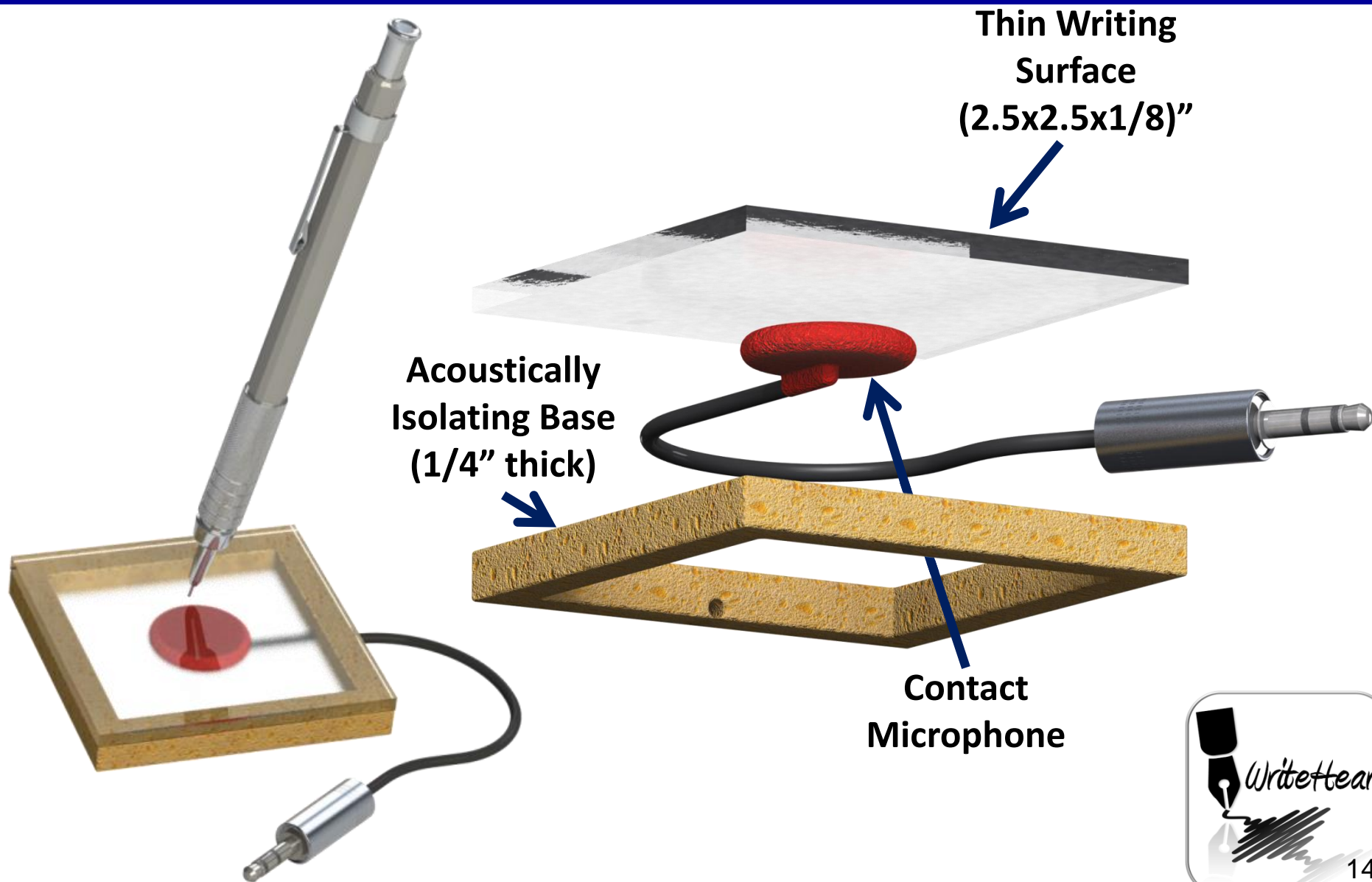
Spellcheck database contains  
over 58,000 words







# Hardware





# Testing and Analysis





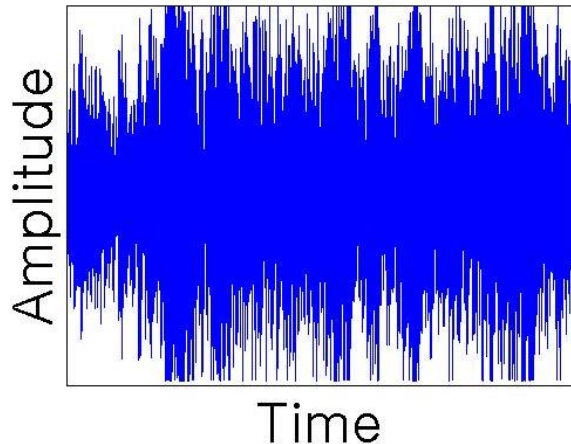
# Type of Mic.

## Dynamic



- Electromagnetic induction
- Senses vibrations through air and solid objects
- Susceptible to noise

### 90 dB Noise Test



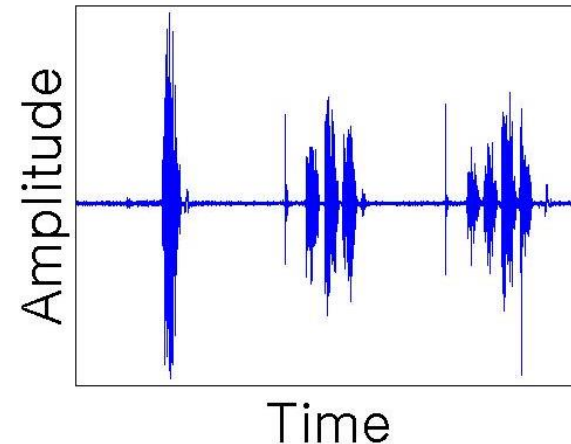
Vs.

## Contact



- Piezoelectric
- Senses vibrations through solid objects only
- Significantly less effected by noise

### 90 dB Noise Test







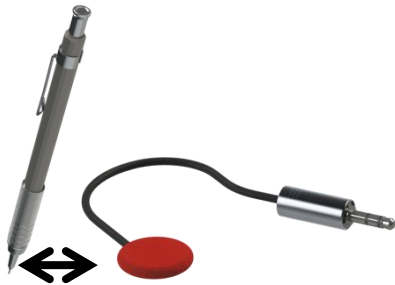
# Distance From Mic.

1 inch



Vs.

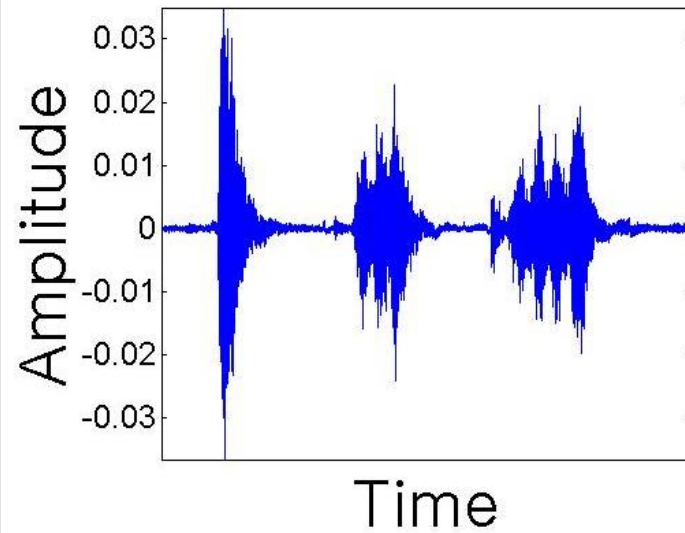
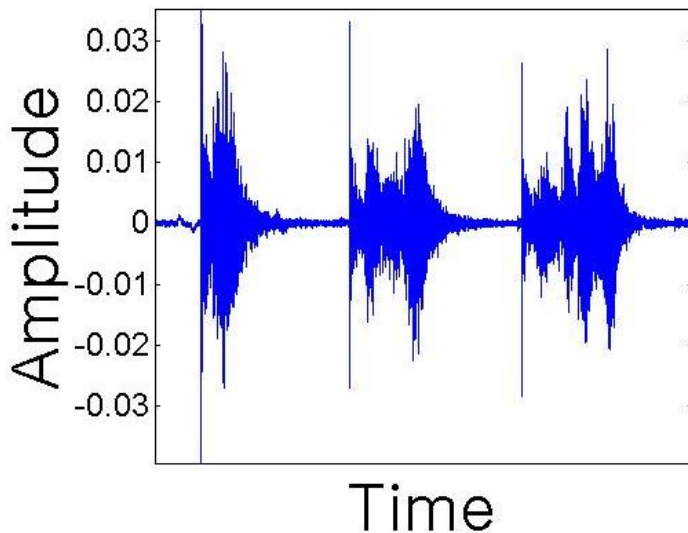
48 inches



- Amplitude = 0.01-0.03
- Unaffected by distance



- Amplitude = 0.01-0.03
- Unaffected by distance





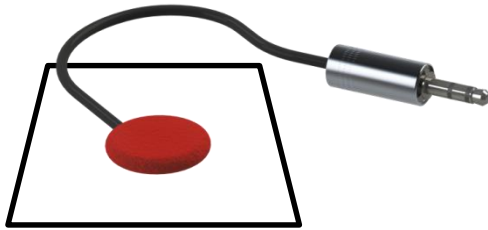
# Surface Size

15 in<sup>2</sup>

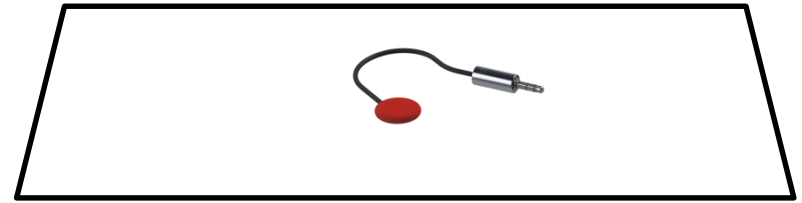


Vs.

720 in<sup>2</sup>

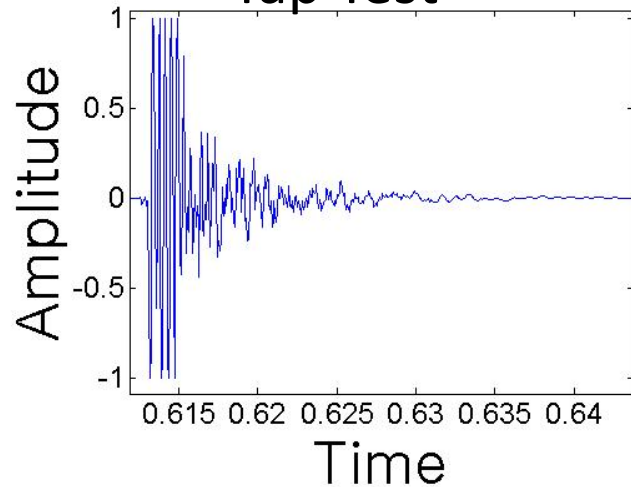


- Time to decay to noise level = 15ms
- More distinct features in writing
- Higher amplitude
- Less susceptible to noise

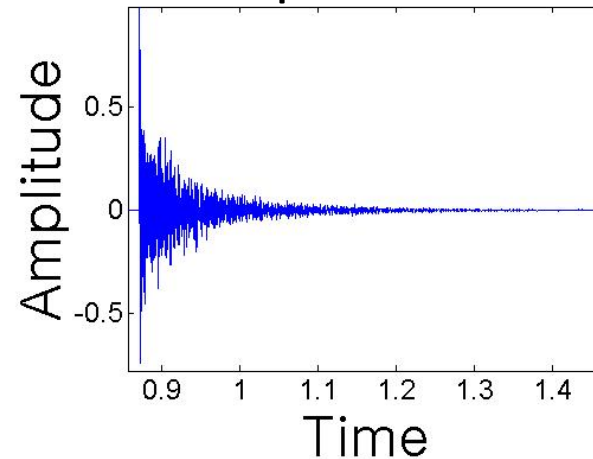


- Time to decay to noise level = 300ms
- Less distinct features in writing
- Lower amplitude
- More susceptible to noise

Tap Test



Tap Test

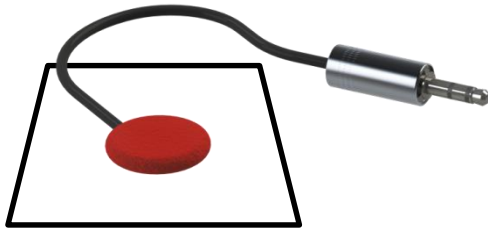




# Surface Material

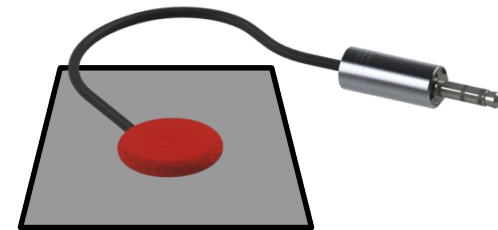


Plastic ✓



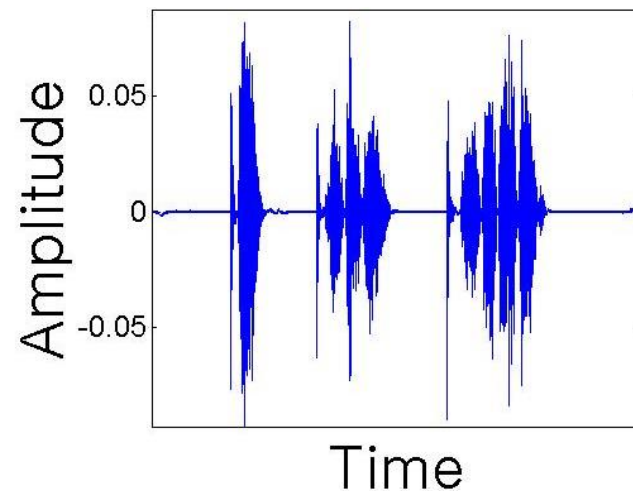
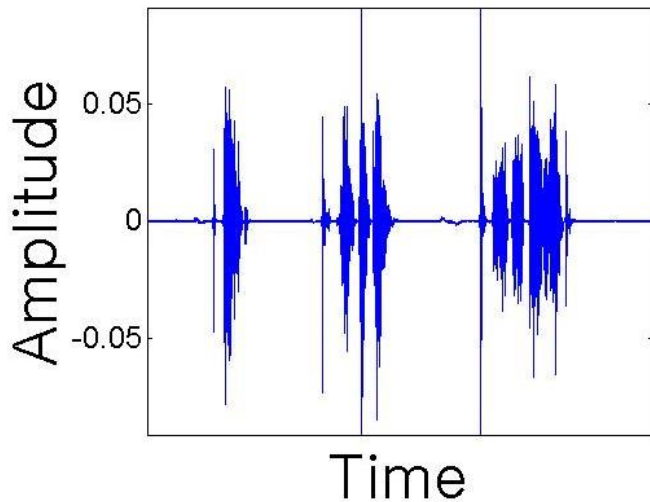
Vs.

Metal ✓



- Negligible effect on amplitude

- Negligible effect on amplitude

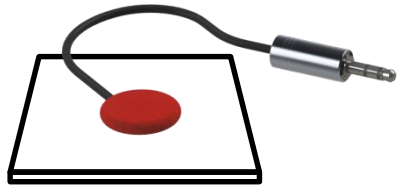




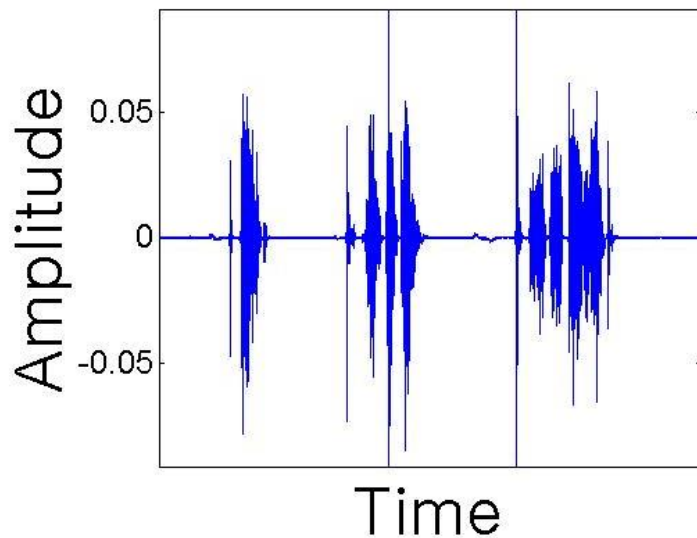
# Surface Thickness



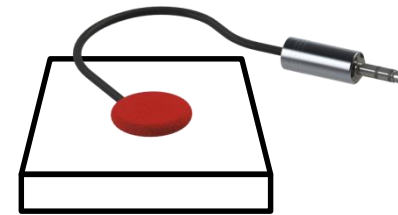
1/8" Thick  Vs.



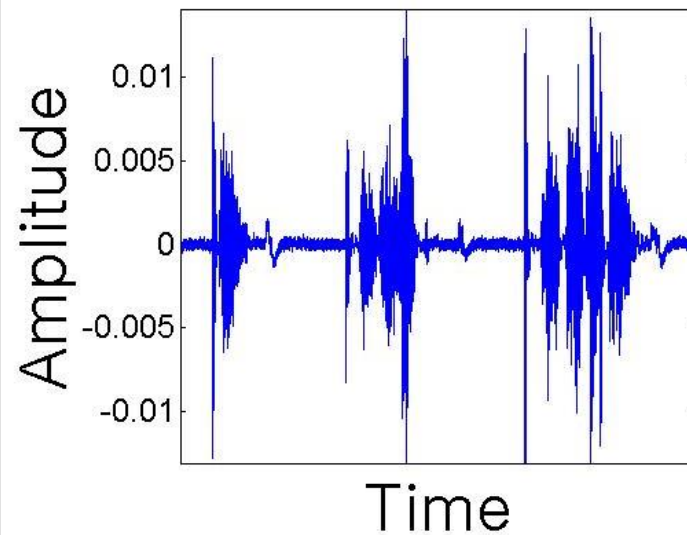
- Amplitude = 0.04-0.05



1/2" Thick



- Amplitude = 0.005-0.01  
(1/8th the amplitude)





# Writing Utensil

Pen

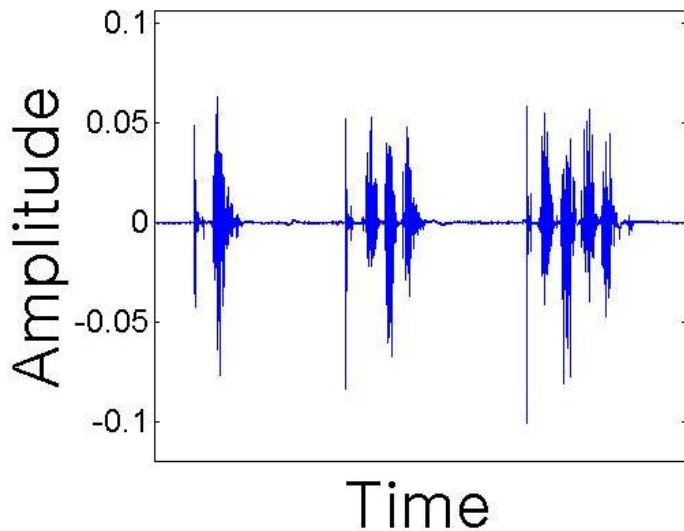


Vs.

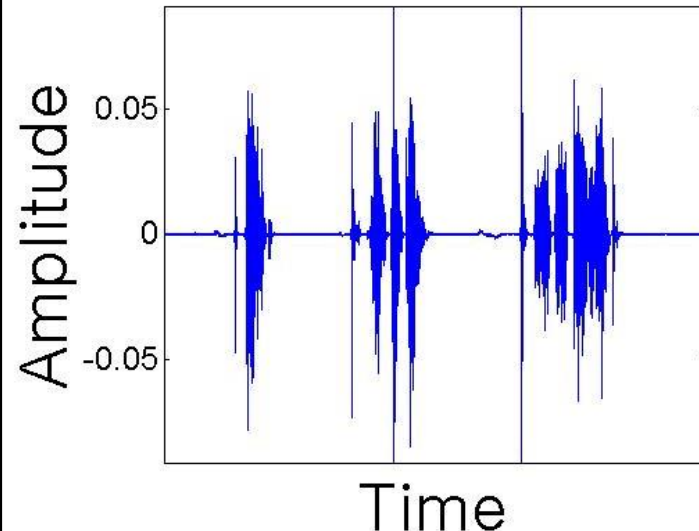
Pencil



- Amplitude = 0.04-0.05



- Amplitude = 0.04-0.05





# Accuracy

A-Z	a-z	0-9	Spellcheck (A-Z)	Signature
<b>87.5%</b>  Based on: 8 Individuals 832 samples	<b>77.9%</b>  Based on: 2 Individuals 208 samples	<b>91.7%</b>  Based on: 3 Individuals 120 samples	<b>85.9%</b>  Based on: 3 Individuals 78 words	Type I Error: <b>4.8%</b> Type II Error: <b>6.3%</b> Based on: 3 Individuals 53 samples

- Similar sound profiles for different characters lowers accuracy
- Character accuracy calculated with a template database of 3 samples per character. A similar method was used by SRL at Texas A&M





# Conclusions



- WriteHear is a robust and versatile software that can learn and understand different people's handwriting
- A Contact microphone setup greatly reduces background noise allowing WriteHear to work fine with 90dB (loud traffic)
- WriteHear works with various materials and writing utensils
- WriteHear can catch a forged signature with over 93% accuracy
- WriteHear recognized the upper case letters (A-Z) with 87.5% accuracy, matching the 86.8% accuracy achieved by the Sketch Recognition Lab at Texas A&M





# Future Work



- Continue to improve and optimize software
- Test more conditions such as how a persons handwriting varies over time
- Create a user independent system
- Create a more fluid system where the user can write naturally without having to pause between characters







# References



- Li, W., & Hammond, T. A. (2011, April). Recognizing Text Through Sound Alone. In *AAAI*.

