# Automatic Detection of Parkinson's Disease from Continuous Speech Recorded in Non-Controlled Noise Conditions

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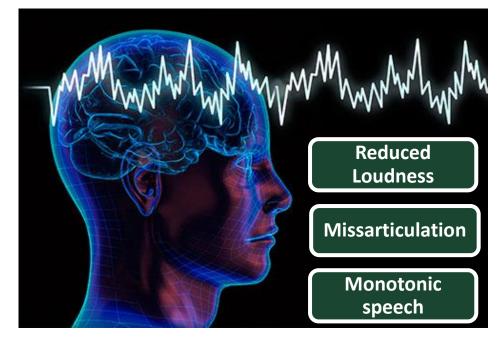
### **Outline**

- 1. Introduction
- 2. Methodology
- 3. Database
- 4. Device
- 5. Results
- 6. Conclusion





- ✓ Voice impairments appear in about 90% of people with Parkinson's diasease.
- ✓ Only from 3% to 4% of patients recieve speech therapy







- ✓ Intereset: Develop computer-aided tools to perform screenings from speech. The main aims are
  - ✓ Spare patients moving from home to the hospital
  - ✓ Raise early alerts to patient and doctors





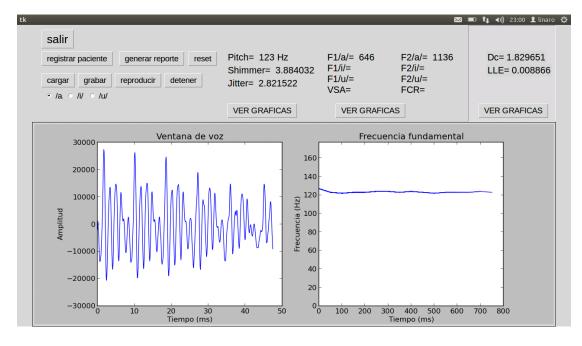
### Currently

- ✓ The devices are mainly focused on the analysis of sustained phonations.
- ✓ The devices could be considered invasives.
- ✓ Methodologies are not adapted for evaluating speech recorded in noncontrolled noise conditions.





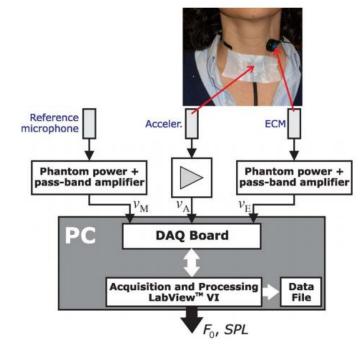
















What is missing?

✓ Portable devices and tools for the analysis of speech of people wirth Parkinson's disease considering continuous speech signals recorded in non-controlled noise conditions.





#### **Aims**

- ✓ Portable device for recording and analysis of speech of patients
- ✓ Evaluation of methodology in non-controlled noise conditions.



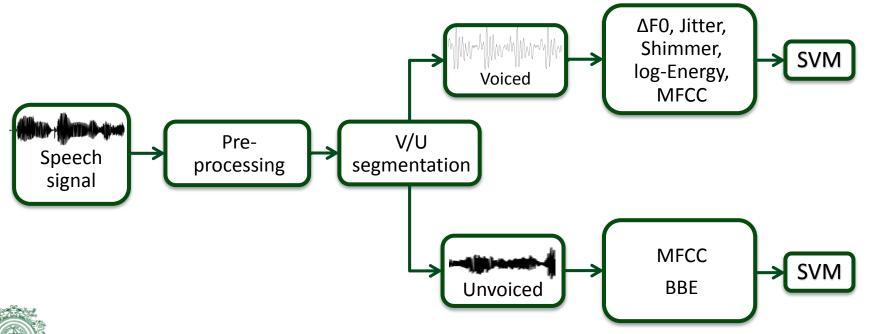


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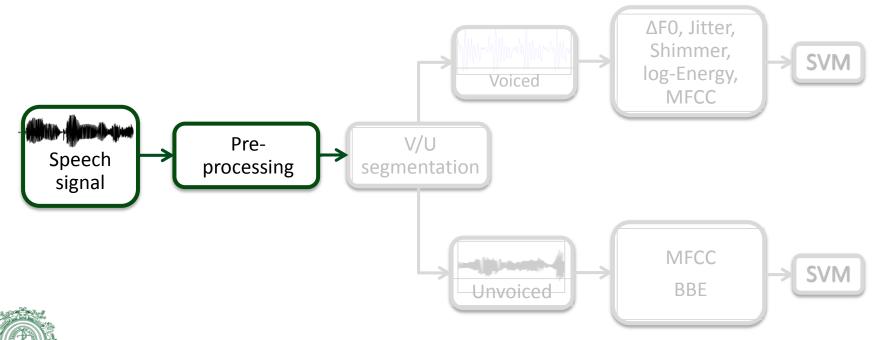








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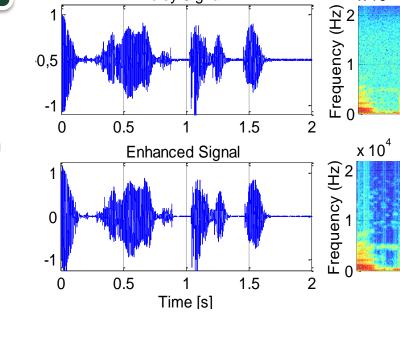




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### **Pre-processing**

- ✓ Speech enhancement
- ✓ Mean cepstral subtraction



Noisy Signal





1.5

1.5

2. Methodology

0.5

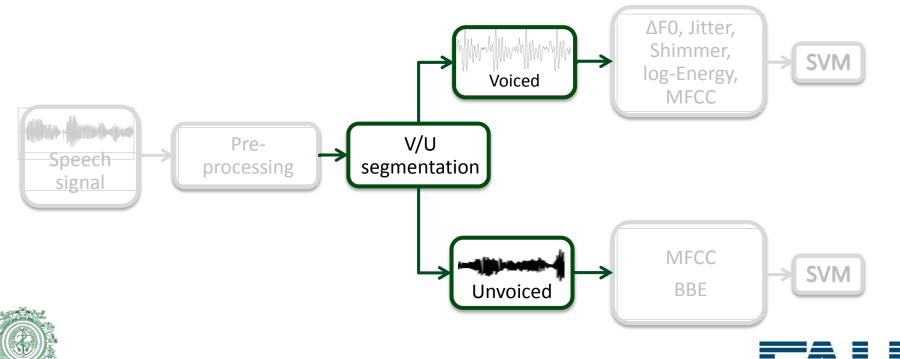
0.5

Noisy Signal

**Enhanced Signal** 

Time [s]

x 10<sup>4</sup>



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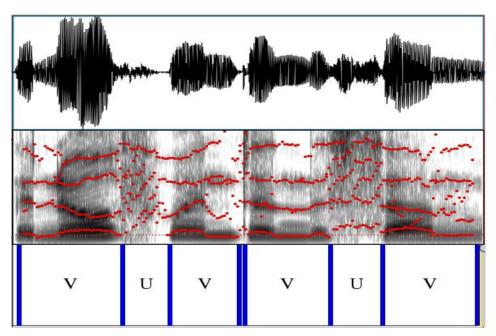
#### Segmentation

Two types of sound:

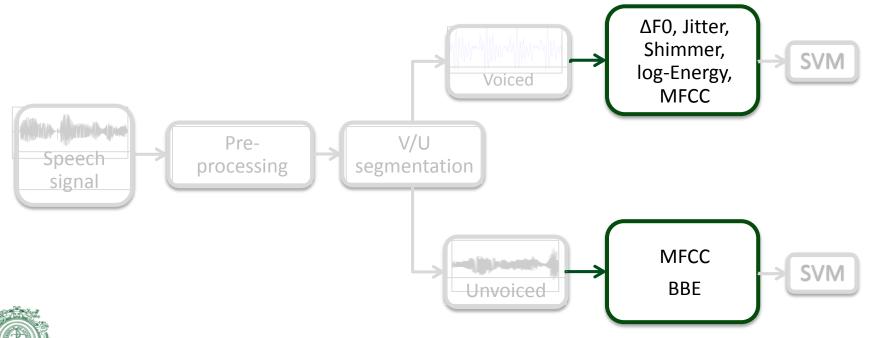
- ✓ Voiced
- ✓ Unvoiced

Both kind of segments are processed independently











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#### Characterization

**Features Voiced Segments** 

- **√** ΔF0
- ✓ Jitter
- ✓ Shimmer
- ✓ log-Energy
- ✓ 12 MFCC

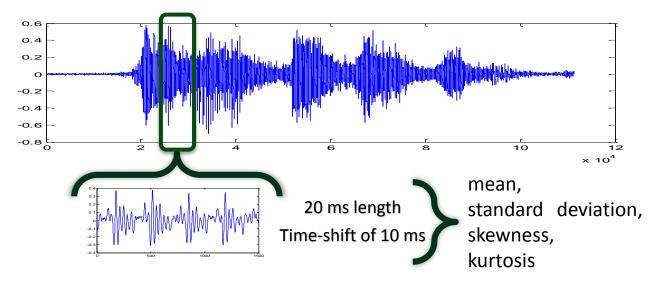
#### **Features Unvoiced Segments**

- ✓ 12 MFCC
- ✓ 25 Energy coefficients according to Bark scale



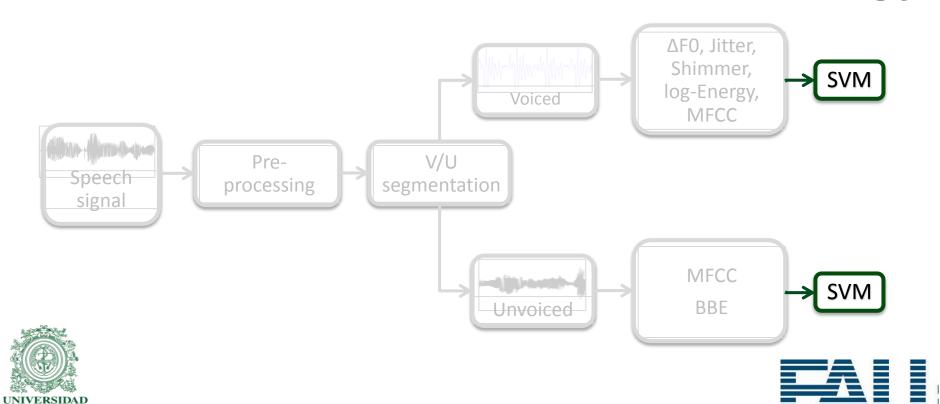


#### Characterization









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#### Classification

- ✓ Gaussian kernel SVM.
- ✓ Parameters of the SVM are optimized in a range:

$$\sqrt{10^{-1}} < C < 10^{-4}$$

$$\sqrt{10^{-2}} < y < 10^{-2}$$

✓ Leave One Speaker Out (LOSO) Cross-validation





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# 3. Database

|                    | Patients with Parkinson's disease | Healthy controls   |
|--------------------|-----------------------------------|--------------------|
| Num recordings     | 14                                | 14                 |
| Age                | Mean 61.64 ± 6.43                 | Mean 63.29 ± 10.43 |
| Gender             | 7 male, 7 female                  | 7 male, 7 female   |
| Sampling frequency | 44100 Hz                          |                    |
| Quantization bits  | 16                                |                    |





# 3. Database

- ✓ Six different sentences
- ✓ One read text with 36 words





### **Outline**

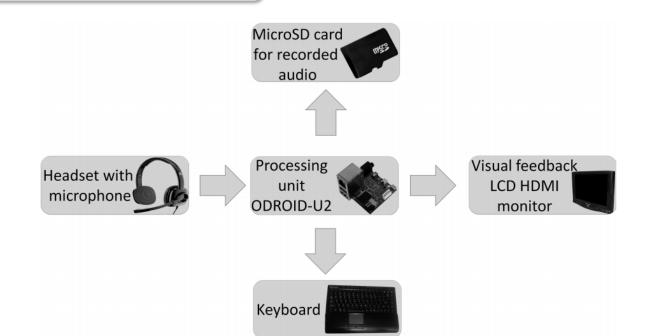
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### 3. Database

### **Recording Device**







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# 4. Results

### **Voiced segments**

| Sentence  | Accuracy (%) |          |
|-----------|--------------|----------|
|           | Noisy        | Enhanced |
| 1         | 71 ± 26      | 82 ± 25  |
| 2         | 75 ± 26      | 64 ± 36  |
| 3         | 71 ± 26      | 79 ± 25  |
| 4         | 86 ± 31      | 79 ± 25  |
| 5         | 79 ± 25      | 82 ± 25  |
| 6         | 86 ± 23      | 75 ± 26  |
| Read text | 79 ± 25      | 71 ± 26  |





### **Unvoiced segments**

| Sentence  | Accuracy (%) |          |
|-----------|--------------|----------|
|           | Noisy        | Enhanced |
| 1         | 92 ± 19      | 93 ± 17  |
| 2         | 94 ± 15      | 91 ± 20  |
| 3         | 86 ± 23      | 97 ± 12  |
| 4         | 93 ± 18      | 94 ± 16  |
| 5         | 78 ± 25      | 90 ± 20  |
| 6         | 86 ± 23      | 97 ± 12  |
| Read text | 99 ± 3       | 99 ± 1   |







### **Unvoiced segments**

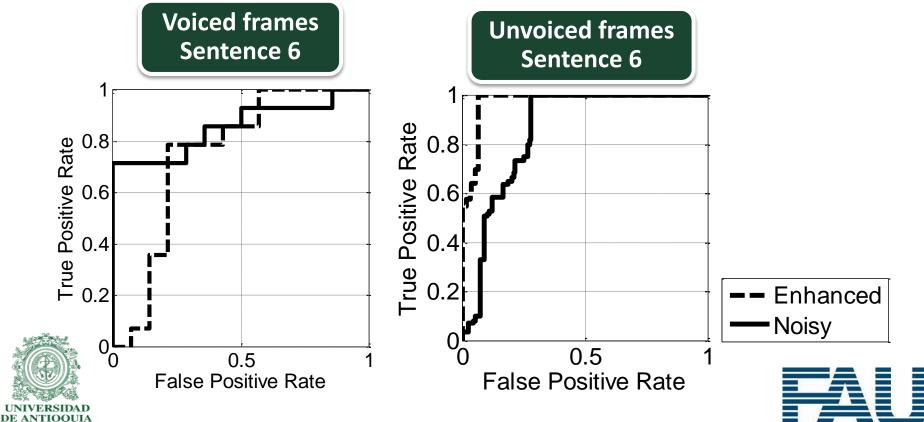
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# 4. Results





### 4. Results



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# 5. Conclusion

- 1. A computational tool is presented for the recording and analysis of speech with Parkinson's disease
- 2. The methodology evaluated considers speech recorded in non-controlled noise conditions.
- 3. It is useful the speech enhancement technique?





# 5. Conclusion

- 4. The incorporation to the methodology of prosody features derived from timing, duration, and speech rate is planned for the near future.
- 5. The use of the computer tool to follow the speech therapy of the patients, and to asses their neurological state is also expected in the future.





### Thanks!







