

# Word boundaries in French: Evidence from large speech corpora

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- Motivation: acoustic cues for word boundaries?
- Methodology & corpus
- Lexical  $f_0$  profiles
- Lexical duration profiles
- Conclusion

- context: French interdisciplinary research projects (*Computer Sciences, Linguistics*)
- preliminary question: how do ASR systems locate word boundaries?  
mainly rely on lexical & word n-gram information
- question: are there acoustic cues signaling word boundaries in French?
- make use of large corpora and automatic processing tools
- hypothesis: prosodic cues ( $f_0$ , duration)

⇒ **produce empirical evidence from large corpora**

⇒ **investigate whether prosodic realisations may contribute to address the word segmentation problem**

⇒ **increase our knowledge of prosodic realisations in French words**



- French:  $f_0$  and duration tend to increase on most prosodic word endings (continuation)

Example:

*prosodic words*

(le couple)(est complet)...

(le couplet)(complet)...

*homophonic*

/ləkuplɛkõplɛ/

*French prosody*

le **couple** est complet

le cou**plet** complet

- prosodic word endings are a subset of (content) word endings
- influential factors: word length, word-final schwa, POS...

- French TECHNOLANGUE-ESTER1 corpus (Galliano 2005)
- broadcast news shows from French radio stations
- subset of 13 hours of male speakers
- 165k word tokens – 14k word types
- mainly “prepared” journalistic speech style

# Methodology: processing steps

audio stream:

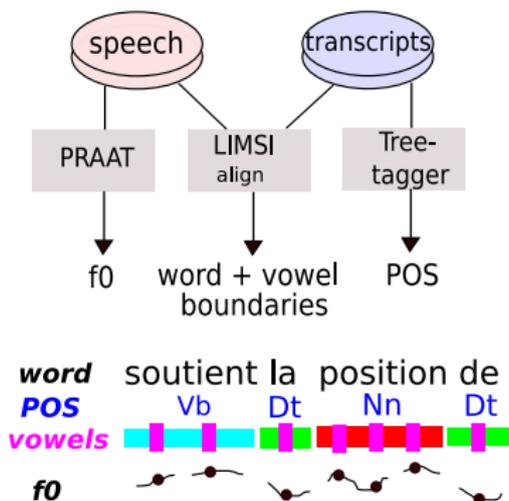
- $f_0$  measurements each 5 ms (Praat, Boersma 2005)

audio + word streams:

- word & vowel boundaries (LIMSIS speech alignment system, Gauvain 2005)

word stream:

- POS tags (Treetagger, Schmid 1994)



## Methodology: syllabic word length classes

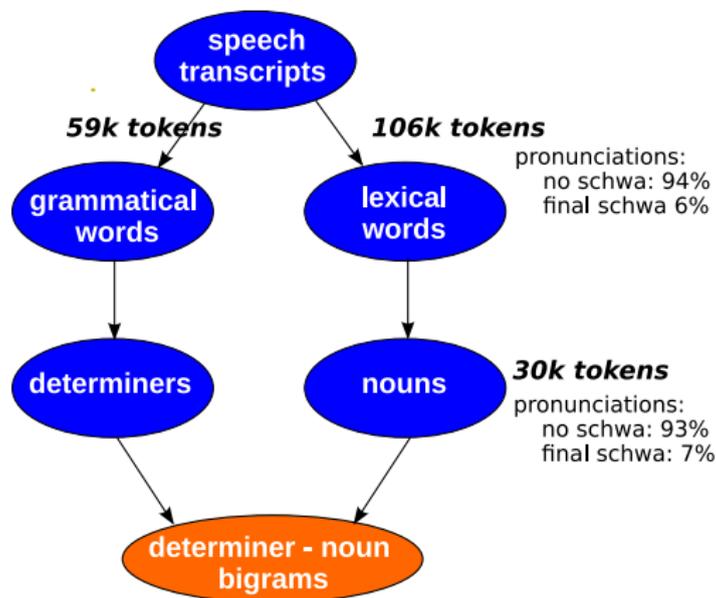
$n$  : syllabic word length

word class  $n_0$  : words with  $n$  syllables and **no final schwa**

word class  $n_1$  : words with  $n$  syllables and **with final schwa**

$n$	$n_s$	#words	examples
0	0_0	13k	l'; d'; de
1	1_0	72k	vingt; <b>reste</b>
2	2_0	36k	beaucoup; journal
3	3_0	16k	notamment; militaire
4	4_0	6k	présidentielle
		<i>#words+ /ə/</i>	
0	0_1	12k	de; le; que
1	1_1	4k	<b>reste</b> ; test
2	2_1	2k	ministre
3	3_1	0.7k	véritable
4	4_1	0.2k	nationalistes

# Methodology: grammatical vs content word classes



$f_0$  profiles: computed for each word class ( $n_s, \dots$ )

only vowels with *voicing ratio* over 70% were used (rejection rate 10%)

$$(\text{voicing ratio} = \frac{\text{number of voiced frames}}{\text{total number of frames}})$$

for each vowel a mean  $f_0$  value was computed (all voiced frames of segment)  
values in Hz converted to semitones (st), 120 Hz as reference frequency

**example:  $n_s = 2_0$**

$2_0$  : class of bisyllabic words without final schwa:

$f_0$  profile: (average  $f_0$  of rank 1 vowels) + (average  $f_0$  of rank 2 vowels)

# Mean $f_0$ profiles of $n$ -syllabic lexical words

lexical words without final schwa (1-4 syll.)

word classes:

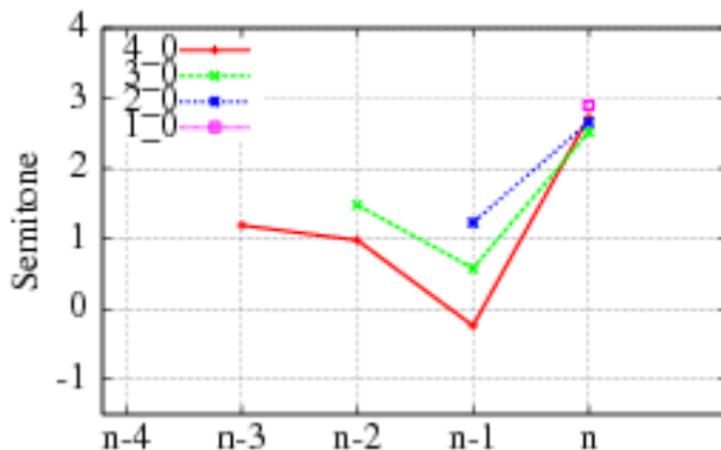
1\_0 monosyllabic words without final schwa

2\_0 bisyllabic words without final schwa

3\_0 trisyllabic words without final schwa

4\_0 4-syllabic words without final schwa

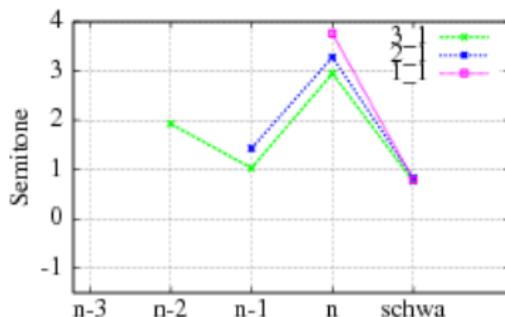
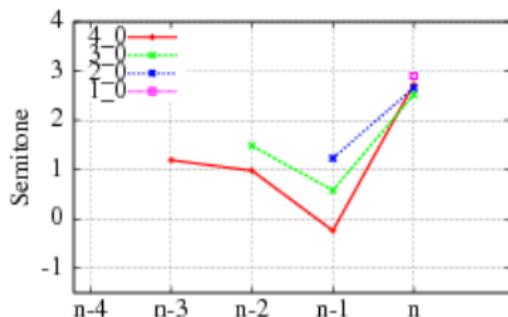
profiles are aligned w.r.t. to the final syllable  $n$



x-axis: vowel rank (w.r.t. final syllable vowel) - y-axis:  $f_0$  (in semitones)

# Mean $f_0$ profiles of $n$ -syllabic lexical words

**left:** words without final schwa (1-4 syll.) **right:** with final schwa (1-3 syll.)



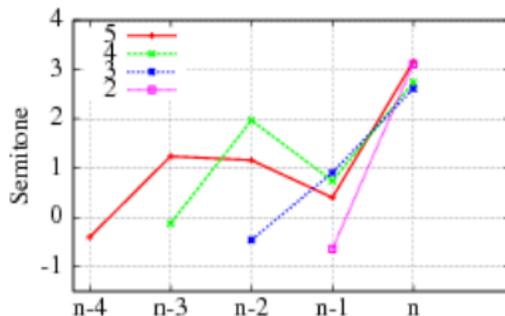
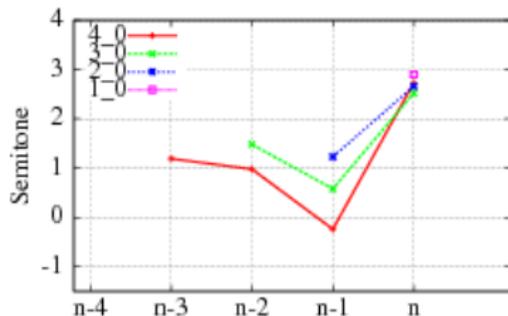
x-axis: vowel rank (w.r.t. final syllable vowel) - y-axis:  $f_0$  (in semitones)

- (i)  $f_0$  much higher for the final syllable  $n$  than for the preceding ones.
- (ii) for trisyllables+,  $f_0$  delta maximal between final & penultimate vowels  
difference tends to increase with word syllabic length.
- (iii) monosyllabic  $f_0$  as high as that of the final syllable of longer words.
- (iv) final schwa ( $n-1$ ) profiles globally higher  $f_0$  than  $n-0$  profiles,
- (v) delta between final syllable  $n$  and final schwa : 2-3 st.
- (vi) weak initial accentuation

# Mean $f_0$ profiles of $n$ -syllabic noun phrases (no final schwa)

**left:** nouns (1-4 syll.)

**right:** det + noun 13k occ. (2-5 syll.)



x-axis: vowel rank (w.r.t. final syllable vowel) - y-axis:  $f_0$  (in semitones)

(i) noun phrase:  $f_0$  minimal on 1st syllable

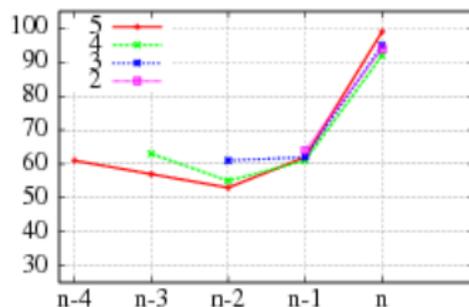
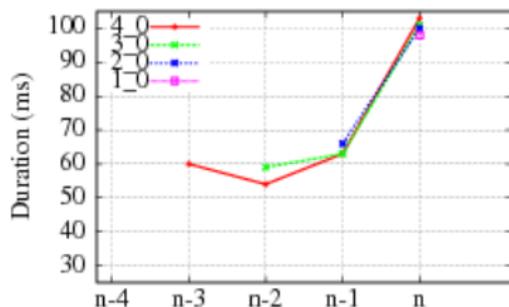
(ii) max. delta  $f_0$  between 1st syllable (monosyllabic det.) & last syllable (noun)  
within a temporal window of some syllables,  $f_0$  may provide cues for phrase boundaries, at least for the noun phrase case (determiner noun)

## Lexical duration profiles: based on vocalic durations

mean vocalic segment duration for each vowel rank  $k = 1 \dots n$

**left:** nouns (no final schwa)

**right:** noun phrase (no final schwa)



x-axis: vowel rank (w.r.t. final vowel) - y-axis: vocalic segment duration (ms)

(i) final vowel duration  $\sim 100$  ms on average

(ii) all other vowels  $\sim 60$  ms on average

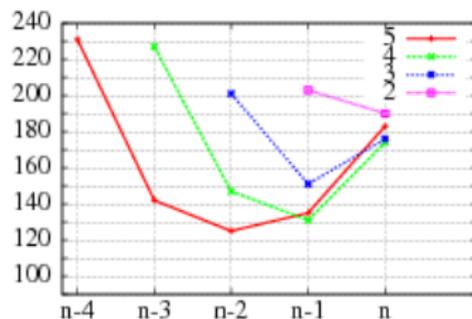
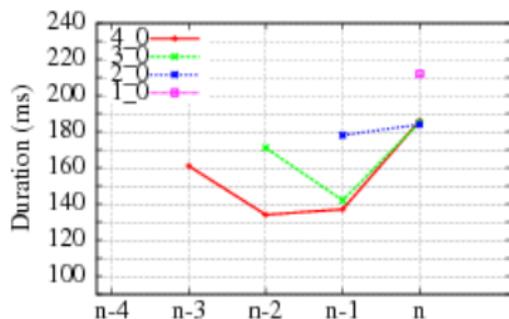
high segment duration: cue for word ending (noun)

# Lexical inter-vocalic duration (IVD) profiles

mean IVD for each vowel rank  $k = 1 \dots n$  (between preceding & present vowels)

**left:** nouns (no final schwa)

**right:** noun phrase (no final schwa)



x-axis: vowel rank (w.r.t. final vowel) - y-axis: IVD duration (ms)

(i) high inter-vocalic duration  $\sim 180$  ms on final vowels

(ii) very high IVD  $\sim 220$  ms on phrase-initial vowels

high IVD: cue for prosodic word boundaries (in particular noun phrase start)

## *Are there acoustic cues signaling word boundaries in French?*

- **Hypotheses** concerning influential factors:  
syllabic word length, presence/absence of word-final schwa, syntax
- 13 hours of broadcast news speech - 165k words - male speakers
- Automatic tools for annotation:  $f_0$ , duration, vowels, syllabic rank, POS
- Original methodology to study prosodic regularities of French words via average lexical profiles

## *Word boundary information evidenced via average $f_0$ , VD, IVD profiles:*

word final syllable  $f_0$  rises  
long word final syllable lengths  
long IVD on phrase boundaries



Measurable cues contributing to word boundary location can be found!

### Future studies:

other POS sequences, more prosodic words, more detailed  $f_0$  patterns  
other speaking styles (especially spontaneous speech), other languages

### Findings for ASR:

acoustic modelling  
post-processing step for error recovery (improved boundary location)



**Thank you for your attention**

