### How Meaningful These Intonational Contours Are!

Byron Ahn • Nanette Veilleux • Bethany Sturman • Alejna Brugos • Sunwoo Jeong • Stefanie Shattuck-Hufnagel

### 1. Introduction

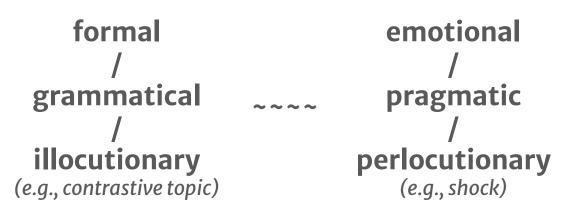
English exclamatives' syntactic forms

- a. Salvador is very successful!
- b. How very successful Salvador is!
- c. Has Salvador been successful!
- d. The success Salvador has had!

→ ...intonational forms?

### 2a. Background: Intonation?

Suprasegmentals (e.g., f0, intensity, duration) that convey 'post-lexical' meanings



Analysis may require some human annotation (e.g., ToBI, PoLaR)

### 2b. Background: Exclamatives!

Rett & Sturman (2021) on mainstream US English exclamatives:

> [mirativity] (syntactic/semantic core)

L+H\* (prosodic core)

Other acoustic features: iconically enhance exclamative meaning

### 3. Research Goals

**Primary Goal:** 

Model of which aspects of intonation signal an utterance's status as exclamative

**Secondary Goal:** 

(from

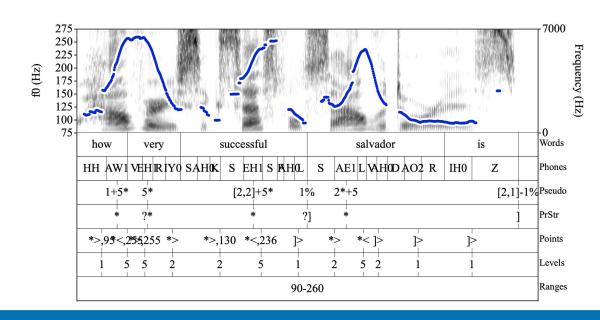
R&S)

Proof of concept for future work on intonational meaning

**Central Question** 

### Is there an intonational core

to English exclamatives?



# 4. Methods



A preliminary model of the intonation of exclamative utterance

**Machine learning 2** (supervised) Random Forest Classification

### 5. Results

- Clustering analysis finds 3 groups of pitch accents, differentiated by slope (between\_SS / total\_SS = 81.1 %)
  - → Cluster K2 looks like L+H\*
- Classification analysis distinguishes exclamatives (Estimated Error Rate: 14.08%)
  - → Usage of K2 very important
  - $\rightarrow$  Many of R&S' other findings are replicated too

### 6. Conclusions / Future Work

- Results support R&S' findings based on phonological labels
  - Using non-phonological labels + analysis
- **Proof of concept:** emergent cluster categories potentially standing in for phonological labels
  - Methodology for new domains / languages / varieties beyond current model of MUSE phonology

#### Selected References:

- Beckman & Hirschberg. 1994. The ToBI annotation conventions.
- Ahn et al. 2021. PoLaR Annotation Guidelines (version 1.0). Available at
- Rett & Sturman. 2021. Prosodically marked mirativity. In Proceedings of WCCFL 37.

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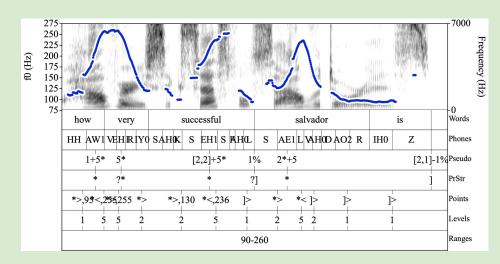
B. Ahn<sup>1</sup> ° N. Veilleux<sup>2</sup> ° B. Sturman<sup>3</sup> ° A. Brugos<sup>2</sup> ° S. Jeong<sup>4</sup> ° S. Shattuck-Hufnagel<sup>5</sup>

 $^1$ Princeton University  $\circ$   $^2$ Simmons University  $\circ$   $^3$ UCLA  $\circ$   $^4$ Seoul National University  $\circ$   $^5$ MIT

#### **Exclamatives forms**

- Exclamative meanings in English map onto a variety of syntactic forms:
  - a. (Wow,) Salvador is very successful!
  - b. (Wow,) how very successful Salvador is!
  - c. (Wow,) has Salvador been successful!
  - d. (Wow,) the success Salvador has had!

An example how they map onto intonation:



Varied syntactic forms of exclamatives have a common core, but...

## Is there a common intonational core to exclamatives?

#### **Background - Exclamative Intonation**

(syntactic/semantic core)

Previous work by Rett & Sturman (2021) on mainstream US English exclamatives e.g., **What biq teeth you have!** 

Empirical findings:

Categorical Measures		Continuous Measures	
	L+H* pitch accents	Extra high pitch accent peaks Increased rhythmicity	
Analysis:			
	[[mirativity]]	L+H*	

(prosodic core)

Other intonational characteristics: iconically enhance exclamative meaning

#### **Our Research Goals**

- Can we verify this analysis with a different methodology?
- Primary Goal:

### Model which aspects of intonation have predictive power to classify utterances as exclamative

- Using more intonational details in the model (e.g., those lost in categorical annotations like ToBI)
- Transcribing intonation with PoLaR (uniform across languages, facilitating cross-linguistic comparison\*)
- Secondary Goal: Verify PoLaR + data mining methods to investigate semantic/pragmatic categories
  - Proof of concept for future work on intonational meaning

#### **Methods**

www.polarlabels.com pitch accent features

#### **Data**

128 exclamatives 128 fillers (data from R&S)

#### **PoLaR Annotation**

(Ahn et al. 2021)
Identification of key intonational properties

#### **Feature extraction**

PoLaR-facilitated extraction of granular acoustic features

PoLaR features +
PoLaR-guided ——
acoustics

### Machine learning 1: K-means clustering

Unsupervised classification of pitch accents into clusters

emergent pitch
accent groups +
usage rates

		Predicted as:		
-	Actual:	Filler	Excl.	Class error
	Filler	23	7	0.23 (7/30)
	Excl.	3	38	0.07 (3/41)

Estimated Error Rate (on held out data): **14.08**%

### Machine learning 2 (supervised): Random Forest Classification

Supervised learning based on K-means clusters

- + acoustic/annotation features
  - → classify as exclamative or not
  - → indicate feature usefulness

#### **Goals: Met**

Can we verify R&S' analysis with a different methodology?

Primary Goal:

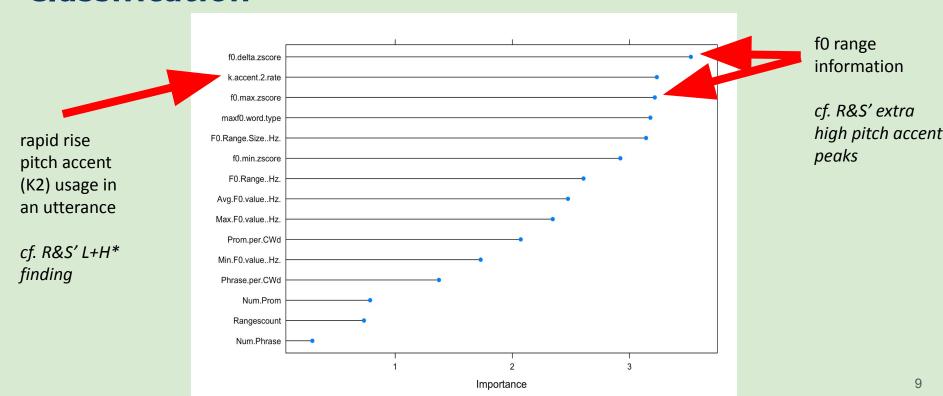
Model which aspects of intonation have predictive power to classify utterances as exclamative

→ Achieved!

Secondary Goal:

Proof of concept for future work on intonational meaning

### Relative Importance of Features in Random Forest Classification



#### **Goals: Met**

- Can we verify R&S' analysis with a different methodology?
  - → YES! Using non-phonological labels + analysis
- Primary Goal:

Model which aspects of intonation have predictive power to classify utterances as exclamative

Secondary Goal:

Proof of concept for future work on intonational meaning

→ Achieved!

#### **Discussion & Conclusions**

- Proof of concept: Emergent cluster categories potentially standing in for phonological labels
- Advantages for this methodology include:
  - PoLaR's low barrier to entry
  - PoLaR's usability in new domains / languages / varieties beyond current model of MUSE phonology
  - Replicability of machine learning analyses

#### **Coming Soon...**

- A complete analysis of this entire dataset
- PoLaR-bsed analysis tools (PoLaR Basic Extraction and Analysis in R)
- More work on meaning and intonation (NSF-supported grant work)

### Thank you!