

# Relationships Between Prosodic-Linguistic Features and High-Level Descriptors of Speed Dates

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## Abstract

We extract lexical and prosodic features of speech from 1493 speed dates at Stanford University. Each speed date is accompanied by information about what each participant thought of the other, including 1-10 assessments of courteousness and funniness. Here, we investigate prediction of these assessments from lexical and prosodic features. We find that for many labels, lexical and prosodic features can powerfully predict our high-level descriptors.

**Index Terms:** Prosody, Speed Date, AdaBoost, Gender differences in prosody, factor analysis, courteous, funny

## 1. Introduction

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## 2. Data

We were given, courtesy of Jurafsky (2013), a dataset consisting of 1980 (CHECK THIS VALUE) heterosexual speed dates. For each date, we have two .wav files corresponding to the microphones attached to each participant. We also have high-level descriptors of each participant, including their height, weight, and ethnicity. In addition to this, for each participant, we have 1-10 assessments of various qualities of both themselves and each other person they went on a speeddate with, including funniness and courteousness.

### 2.1. Feature Extraction

Prosodic features were extracted using openSMILE. Lexical features were extracted in Python, with the help of the LIWC dictionary.

## 3. Exploratory Analysis

Before attempting to classify speakers as funny or not, we examine the underlying dimensions along which the data varies. To do, so we use exploratory factor analysis. To determine the number of factors, we use a scree test and various non-graphical measures, including parallel analysis and an optimal coordinates test, as described in (CITE). We find an optimal number of factors  $k = 5$  for both males and females, conducted separately. Figure 1 shows the two scree plots.

Interestingly, although we find that the various factors for male and female speech are similar, they explain different

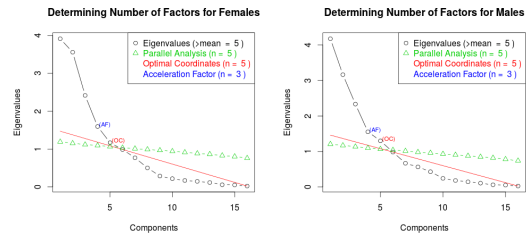


Figure 1: Determining Number of Factors

amounts of variation in the data. For males, the first factor reflects high intensity values and low intensity variation, explaining

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ratio	decibels
1/1	0
2/1	≈ 6
3.16	10
10/1	20
1/10	-20
100/1	40
1000/1	60

#### 4.5. Equations

Equations should be placed on separate lines and numbered. Examples of equations are given below. Particularly,

$$x(t) = s(f_{\omega}(t)) \quad (1)$$

where  $f_{\omega}(t)$  is a special warping function

$$f_{\omega}(t) = \frac{1}{2\pi j} \oint_C \frac{\nu^{-1k} d\nu}{(1 - \beta\nu^{-1})(\nu^{-1} - \beta)} \quad (2)$$

A residue theorem states that

$$\oint_C F(z) dz = 2\pi j \sum_k \text{Res}[F(z), p_k] \quad (3)$$

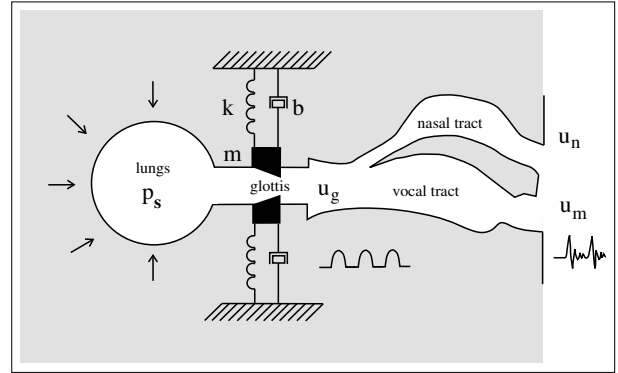


Figure 2: *Schematic diagram of speech production.*

Applying (??) to (??), it is straightforward to see that

$$1 + 1 = \pi \quad (4)$$

Finally we have proven the secret theorem of all speech sciences. No more math is needed to show how useful the result is!

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This is the next paragraph of the discussion. And the last sentence of it.

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### **7. Acknowledgements**

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### **8. References**

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