# From position to function: Exploring word distributions within intonation units in American English conversation 

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## 1 Introduction

Traditionally, Firthian semantics (Firth 1957) examines meanings of linguistic forms through cooccurrences with other forms. This distributional method has enjoyed tremendous success in computational approaches, yet there has been less attention to how forms are distributed within larger units. Discourse markers' functions are often linked to positions in interactional units like turns and sequences (e.g. Sato 2008, Kim 2022, FuentesRodríguez et al. 2016), but other form classes or prosodic units like the intonation unit (IU; DuBois 1992, Chafe 1994, Wahl 2015) are less frequently investigated. In this study, we examine the length of IUs in which words appear and position of words within IUs in the Santa Barbara Corpus of Spoken American English (DuBois et al. 2000), which is manually annotated for IUs based on acoustic cues (DuBois 1992). We find strong systematicity in word distributions across the lexicon, modellable with simple probabilistic models.

## 2 Exploring prosodic profiles

We first plot the distribution of words within the IU in heatmaps (Figure 1). Most words display clear tendencies as to where they appear in IUs, with three types of patterns. Firstly, words have different length preferences: Interjections prefer very short IUs and prepositions typically prefer longer ones. Secondly, some distributions are centred around a fixed place value, e.g. subject pronouns tend to be first and auxiliaries second. Finally, some distributions are centred around a fixed value from the end of an IU: accusative pronouns tend to come last, while determiners and prepositions are typically 1-2 places from the next IU boundary. Some words display bimodal distributions: conjunctions often have one mode near the front of an IU and another, smaller one near the end.


Figure 1: Heatmaps of place and length for the short-biased right (a), front-biased would (b), endbiased the (c) and bimodally distributed or (d). The $y$-axis gives the length of the IU where a word appears; the $x$-axis gives the place, i.e. sequential position of a word within an IU. The darker a position in the heatmap, the more tokens found in it.
Hierarchical clustering on the joint distributions of the 200 word-types with highest Juilland's $U$ (Gries 2008) values, based on Tai \& Pham-Gia's (2010) measure of cluster width, reveals syntactosemantically interpretable clusters. Results at 22 clusters are in the Appendix. Interjections take up two clusters, typically occupying one-word IUs (and occasionally the ends of longer IUs), consistent with their often strong associations with intonation contours (Norrick 2009). At initial positions of longer IUs are conjunctions and other words relating different stretches of discourse, often serving as prefaces ( $\mathrm{Kim} \&$ Kuroshima 2013) to turns. Wh-words also tend to come first in an IU and modal-evidential verbs (main and auxiliary) second - words typically described as constituting recognisable turn beginnings in turn-initial position (Schegloff 1996), but the IU-initial tendency remains even in turn-medial positions, e.g. after filtering out uppercase-initial instances. One cluster contains words like know and think
preferring final positions of two-word IUs, reflecting their role in stance-marking chunks like I think (Thompson 2002). Words attracted to IU ends include nouns and non-nominative pronouns, projected by words attracted to (ante)penultimate positions like prepositions and determiners.

## 3 Modelling prosodic profiles

To go beyond exploratory analysis to predictive modelling, we model the words' prosodic profiles with a Bayesian approach, focusing on words with unimodal distribution. We adopt a parametric approach so the distributions can be summarised using a small number of interpretable parameters.

For each word, we first modelled the length of IUs that it appears in using a negative binomial distribution. We use the parametrisation standard in negative binomial regression (Ver Hoef et al. 2007) with the following probability mass function:
$f(y ; \mu, \phi)=\binom{y+\phi-1}{y}\left(\frac{\phi}{\mu+\phi}\right)^{\phi}\left(\frac{\mu}{\mu+\phi}\right)^{y}$
where $\mu$ is the mean and $\phi$ a dispersion parameter; the variance is $\mu(1+\mu / \phi)$. Since 0 places are impossible, we truncated the distribution at 0 .

To obtain the joint distribution of place and length, we then modelled the distribution of the place conditional on the length. For the frontbiased words, we modelled the place values directly. Since back-biased words tend to be consistently the same number of places from the end of the IU, we model the back values of those words by subtracting place from IU length and adding one. The conditional distributions of the place and back values were modelled as Poisson distributions with rate parameter $\lambda$, and values below 1 and above the length truncated.

The models were fit in a Bayesian framework in Stan through RStan (Stan Development Team 2023a, 2023b). Priors were set on the parameters as follows: $\lambda \sim \operatorname{Gamma}(3,3), \phi, \mu \sim \operatorname{Gamma}(1,1)$. The means of the posterior distributions of $\lambda$ and $\mu$, along with the 'variance' of IU length $\mu(1+\mu / \phi)$, are shown in Table 1 and Table 2 for eight words.

From $\mu$ values, which reflect length preferences, clearly yes and right are much more biased towards short IUs than the rest. This is expected from their functions as interjections: They can function alone to express stance alignment (DuBois 2007) and, for right, as backchannels. Right has great variance in IU length considering how short the length usually is, reflecting right's secondary use as an adjective.
$\lambda$ values reveal yes and he to be most attracted to the edges of IUs, followed by right, whereas the and $a n$ are the farthest from IU edges. The interjections' attraction to front edges may allow for early action ascription in the IU, considering their stance alignment functions (cf. Levinson 2012 for similar discussions in the context of turns), and the attraction of he, a highly accessible (Ariel 2001) referential expression, to IU beginnings reflects general preferences for producing highly accessible elements first (Levshina 2022). The articles' relatively long distance from the IU edge allows them to project lengthy, inaccessible referential expressions in English.

| word | $\lambda$ | $\mu$ | $\mu(1+\mu / \phi)$ |
| :---: | :---: | :---: | :---: |
| yes | 1.76 | 0.22 | 0.49 |
| he | 1.99 | 6.07 | 8.80 |
| just | 3.20 | 6.03 | 11.7 |
| would | 3.24 | 6.65 | 9.17 |

Table 1: Parameter estimates for front-biased words. Note that these are not true estimates of means and variances because the distributions are truncated.

| word | $\lambda$ | $\mu$ | $\mu(1+\mu / \phi)$ |
| :---: | :---: | :---: | :---: |
| right | 2.67 | 0.58 | 3.85 |
| an | 3.86 | 6.68 | 10.23 |
| little | 3.73 | 7.09 | 10.60 |
| the | 4.59 | 7.01 | 9.83 |

Table 2: Parameter estimates for back-biased words.

## 4 Conclusion and future directions

Words in English conversation reliably pattern as to where they occur in IUs of what length. Some of these distributions can be modelled with simple probability distributions with parameters revealing of the words' functions. This shows location within IUs as a promising avenue for examining linguistic function distributionally, adding to analyses based on collocations and interactional units, perhaps even suggesting refinements of traditional syntaxbased word classes like nouns and verbs, while incorporating interjections/discourse markers that do not fit neatly into sentence-based analyses.

We plan to extend these models to account for special words, e.g. those like 're or ' $m$ where initial positions are much less likely than Poisson-like models predict. We also plan to model words with clearly bimodal distributions like or. Finally, we hope to compare word distributions within IUs with other units like the turn, turn-constructional unit and sequence, to determine how much additional information IUs capture.

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## Appendix

| Interpretation | Examples | Concentrated in |
| :--- | :--- | :--- |
| interjections | hm, oh, <br> right, <br> unhunh | one-word IUs |
| interjections <br> and vocatives | god, mom, <br> sure, uh, <br> why | one-word IUs and, <br> secondarily, other <br> final positions of <br> shorter IUs |
| time-/choice- <br> related | after, <br> before, <br> every, or | mostly beginnings <br> of short IUs + <br> sometimes next- <br> to-last positions of <br> longer IUs |


| conjunction and conjunctionlike words | and, so, which, but | strongly initial, well spread across IU sizes |
| :---: | :---: | :---: |
| subordinators and modals | how, maybe, what, where | strongly initial, well spread across IU sizes (more short-biased than 10) |
| modalevidential verbs | know, mean, think, wanted | second position of two-word IUs |
| semantically light verbs | came, gon, wan, told | second to third positions of moderate-sized IUs |
| contractions and modalevidential verbs | 's, goes, guess, should | second positions of short IUs |
| temporal and modal adverbs | always, just, never, not | third word from the beginning of moderate-sized IUs |
| semantically light verbs | go, want, went, have | 2-4 positions of moderate-sized IUs |
| light <br> (pro)nouns | day, lot, me, anything | final positions of IUs, well spread out across IU lengths |
| (diverse) | around, back, time, say | final position across a range of IU lengths |
| semantically light nouns | everything, something, here | final positions, spread across IU lengths |
| (diverse) | four, kinda, really, remember | final to <br> penultimate  <br> positions <br> shorter IUs of <br>   |
| (diverse) | about, big, long, her | last or penultimate word of moderatesized IUs |
| determiners, light content words, some prepositions | an, tell,very, real, <br> call | penultimate <br> position <br> moderate-sized <br> IUs, highly <br> concentrated |
| semantically light content words | good, years, great, like | penultimate to antepenultimate positions of short IUs |


| mostly <br> determiners <br> and <br> prepositions | all, as, by, <br> first, these | penultimate to <br> antepenultimate <br> words of IUs |
| :--- | :--- | :--- |
| modal and <br> semantically <br> light verbs | be, even, <br> getting, <br> take | penultimate to <br> fourth-from-last <br> positions of <br> moderate IUs |
| prepositions <br> and <br> quantitative <br> determiners | any, in, <br> three, <br> through | antepenultimate <br> and penultimate <br> positions of <br> moderate-sized <br> IUs |
| genitive <br> pronouns and <br> other <br> determiners <br> and <br> semantically <br> light <br> adjectives | another, our, <br> than | antepenultimate <br> position across a <br> range of IU <br> lengths |
| nominative <br> pronouns and <br> modal verbs | are, does, it <br> is, it | well spread out or <br> bimodal <br> distribution of <br> positions, short to <br> moderate IUs |

