# Discovering Phonesthemes with Sparse Regularization

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#### Abstract

- •Goal: Extracting non-arbitrary formmeaning representations (phonesthemes) from word vectors.
- •Treat the problem as one of feature selection for a model trained to predict word vectors from subword features.
- Many model-predicted phonesthemes overlap with those proposed in the linguistics literature; human judgments provide additional validation.

### Phonesthemes

English: apple

Chinese: ping guo

French: pomme

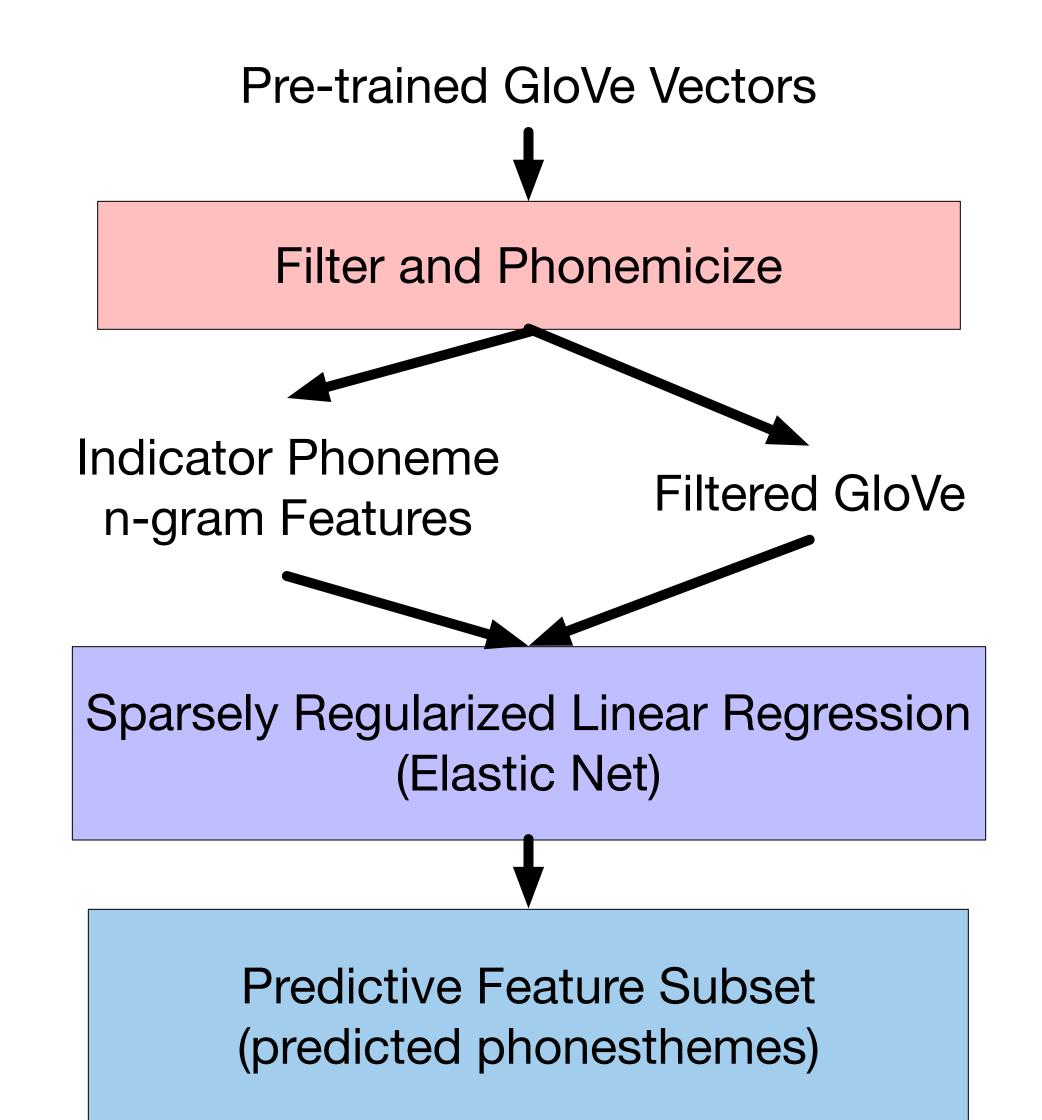
Arabic: tafaha

No link between what an object is and how it's represented in language (de Saussure, 1916).

Phonesthemes: non-compositional, submorphemic phonetic units that consistently occur in words with similar meanings

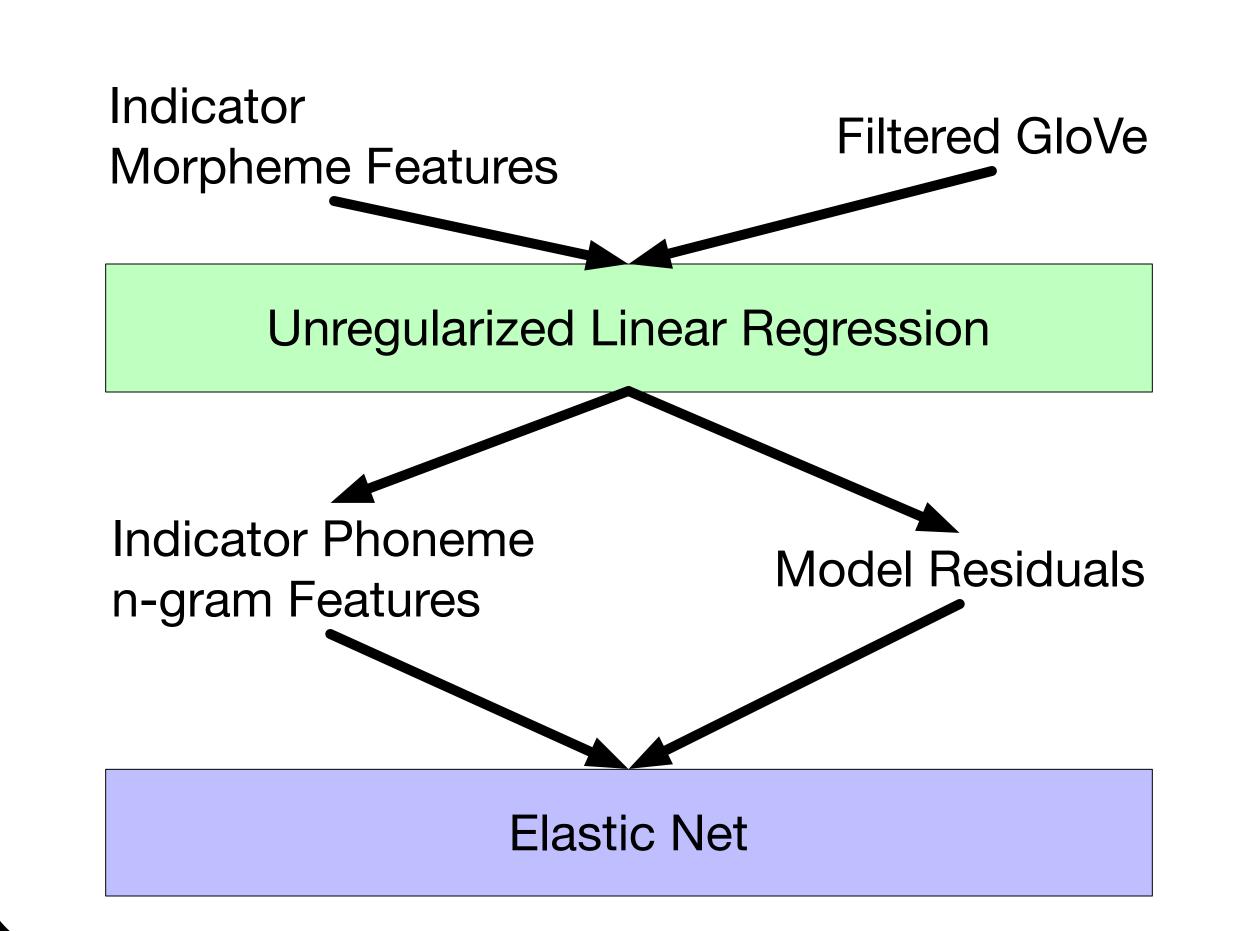
- "gl-": "glow", "glint", "gloss"
- "sn-": "snarl", "sniff", "snooty"

# Phonestheme Identification as Sparse Feature Selection



#### Reducing the Effect of Morphemes

Intuition: remove vector components predictable from morpheme-level information



### **Model-Predicted Phonesthemes**

	Character Sequence	Model Example Words	Character Sequence	Model Example Words
<del>†</del> *	sn-	sneaks, snubs, sniffs	ca-	candied, caffeinated, cataclysm
*	sc-/sk-	screwing, squelched, scurry	pa-	pantry, pathogen, pancake
*	cr-	crunched, cringed, crummy	sy-/si-	syllable, simulators, synchronize
*	sp-	spiffy, splendidly, spunky	fr-	froth, frock, freaks
	br-	brags, brouhaha, brutish	ma-	mallet, masts, manor
*	gr-	griping, grumbles, grandly	pe-	pendant, pelt, petulant
*	tr-	tryst, trounce, truism	me-	meld, meditate, memorized
*	st-	stupendous, startlingly, stunner	mu-	mumbled, mummies, mutter
+ *	bl-	blase, blithely, blankly	* cl-	clumsily, clunky, claustrophobic
*	fl-	flaunted, flowered, fluff	se-/ce	sensuous, celibate, celebrants
+ *	gl-	glossed, gleam, glamor	ob-	obliterate, abridged, obliquely
*	sl-	slouch, slogged, slime	ba-/bo-	barbarous, bogs, barbers
+ *	dr-	droll, dreamer, drifter	pl-	pled, pliable, platoons
+ *	SW-	swoon, swoops, swipes	co-	corset, coroners, corduroy
	wi-	wimpy, willy, wince	fe-	fairest, fender, feds

Table 1: The 30 model-predicted phonesthemes with the highest absolute model weight (1-15 on left, 16-30 on right). \* indicates a phonestheme identified by Hutchins (1998). † indicates a phonestheme with statistical support from Otis and Sagi (2008).

## Human Judgments

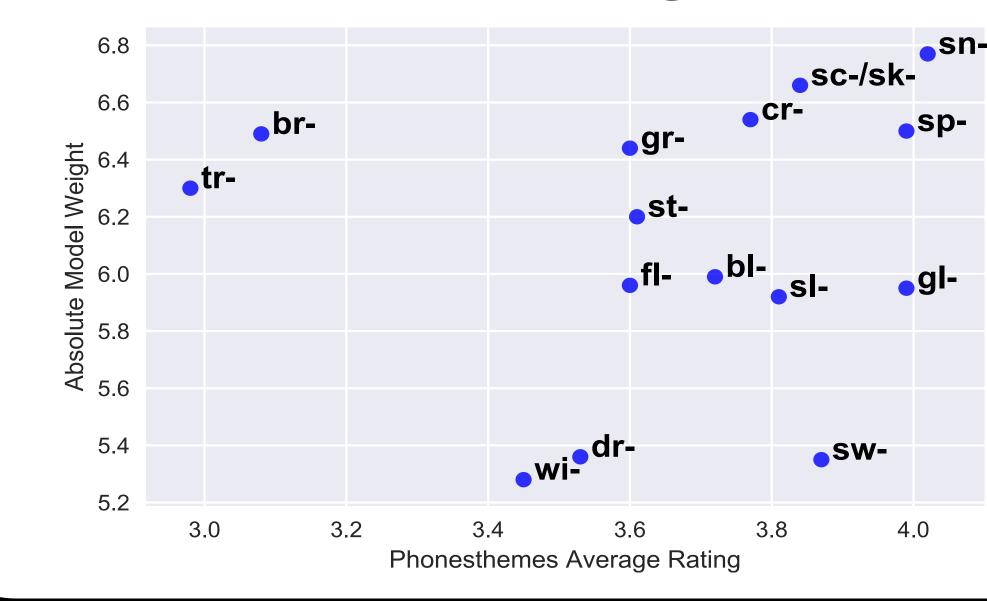


Figure 1: On average, model-predicted phonesthemes were rated 0.58 points higher than unselected phonesthemes (3.66 versus 3.08).

#### References

- E. Dario Gutierrez, Roger Levy, and Benjamin Bergen. 2016. Finding non-arbitrary form-meaning systematicity using string-metric learning for kernel regression. In Proc. of ACL.
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