Trade-offs in computational sociolinguistics methods Accuracy vs. fairness in forced alignment-based auto-coding

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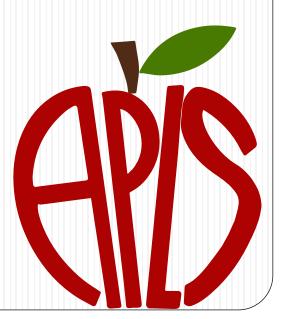
Forced alignment-based auto-coding

doesn't seem to work too good for coronal stop deletion



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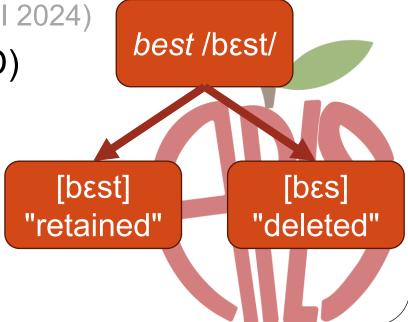
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Sociolinguistic auto-coding (SLAC)

- SLAC: machine learning for labeling tokens with variants (Bailey 2016; McLarty et al. 2019; Villarreal et al. 2020; Kendall et al. 2021)
- But questions remain:
 - How to implement it
 - Whether it's meant to replicate human coding
 - How to account for intergroup fairness (Villarreal 2024)

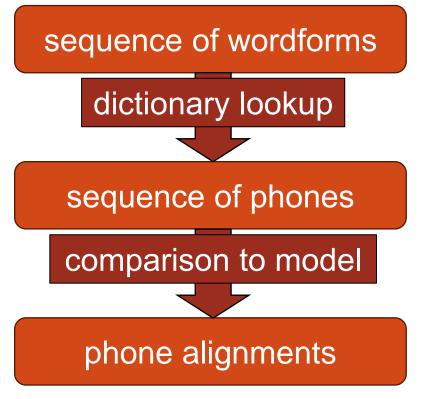
Today: SLAC with coronal stop deletion (CSD)



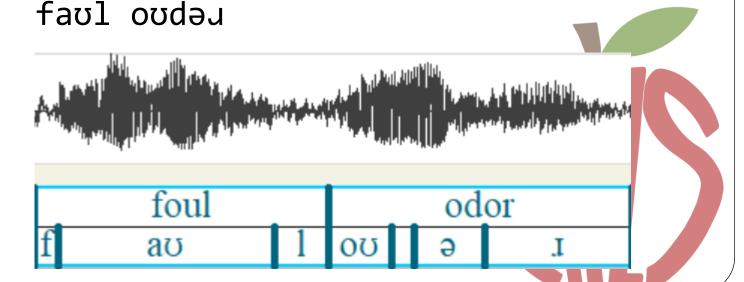
SLAC via forced-alignment

(Bailey 2016; Kendall et al. 2021)

 Exploits forced-aligners' ability to consider multiple candidate phonological representations for the same lexical item



foul odor



SLAC via forced-alignment

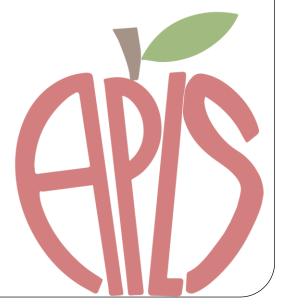
(Bailey 2016; Kendall et al. 2021)

 Exploits forced-aligners' ability to consider multiple candidate phonological representations for the same lexical item

sequence of wordforms dictionary lookup sequence of phones comparison to model phone alignments

the odor

(ði |ðə) oʊdəu



SLAC via forced-alignment

(Bailey 2016; Kendall et al. 2021)

 Exploits forced-aligners' ability to consider multiple candidate phonological representations for the same lexical item

sequence of wordforms

best odor

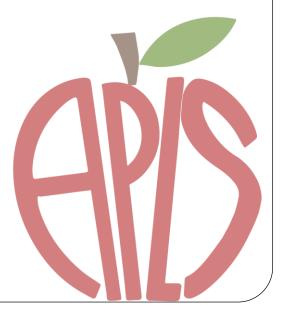
dictionary lookup

sequence of phones

comparison to model

phone alignments

(best bes) oudau

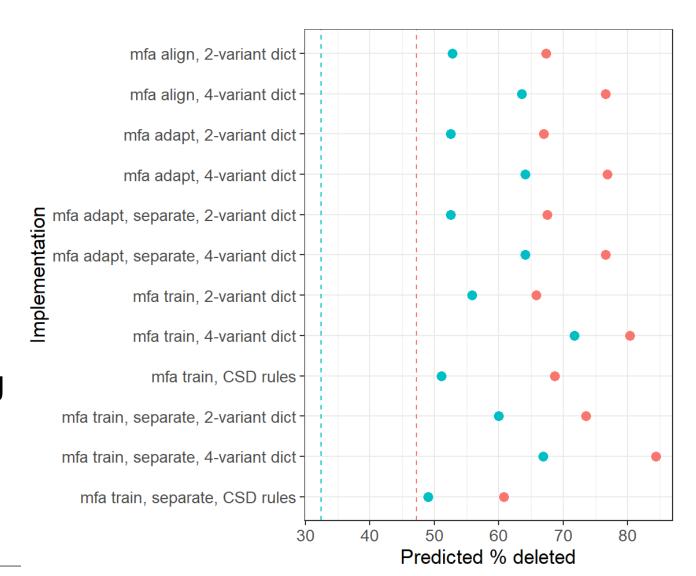


Data & models

- 10,199 CSD tokens from Black & White speakers in Pittsburgh
 - 1005 hand-coded as retained (incl. [r ?]) or deleted
 - Black speakers: 47% deleted (240/508). White: 32% (161/497)
- Entire corpus (33 hours) aligned with Montreal Forced Aligner version 3.1.0 (McAuliffe et al. 2017), in 12 implementations (models):
 - Workflow: align with off-the-shelf english_mfa model, adapt english mfa, train-and-align
 - Strategy: 2-variant dictionary, 4-variant dictionary (w/ [r?]), phono rules
 - Dataset for train-and-align: corpus all at once vs. race-separate
- Output word alignments checked for final [t d (r ?)]

Predictions for hand-coded data (n = 1005)

- All models overpredicted deletion
- 9/12 underpredicted magnitude of race effect on deletion
 - Range of predicted diffs: 8.7–17.6pp
- Difficulty of detecting [t̄'t⁷ r ?]?



Race

- Black
- White

Actual % deleted

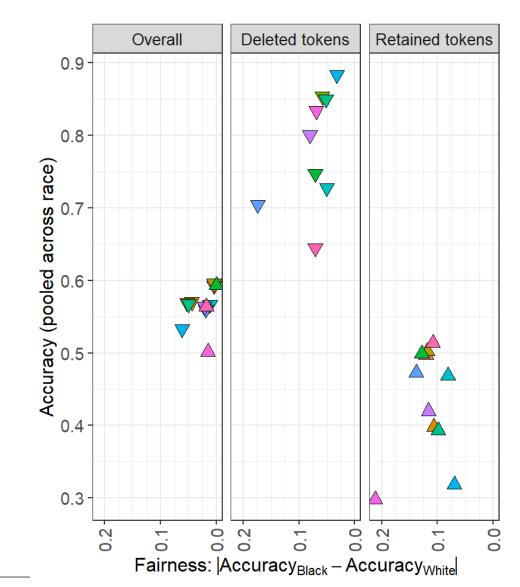
Black White

Accuracy

• SOTA: ~85%

• Here: 50.1–59.6%

- Worse for trainand-align
- Better accuracy for (actual) deleted than retained
 - Because deleted over-predicted



Implementation

- mfa align, 2-variant dict
- mfa align, 4-variant dict
- mfa adapt, 2-variant dict
- mfa adapt, 4-variant dict
- mfa adapt, separate, 2-variant dict
- mfa adapt, separate, 4-variant dict
- mfa train, 2-variant dict
- mfa train, 4-variant dict
- mfa train, CSD rules
- mfa train, separate, 2-variant dict
- mfa train, separate, 4-variant dict
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Disadvantaged group

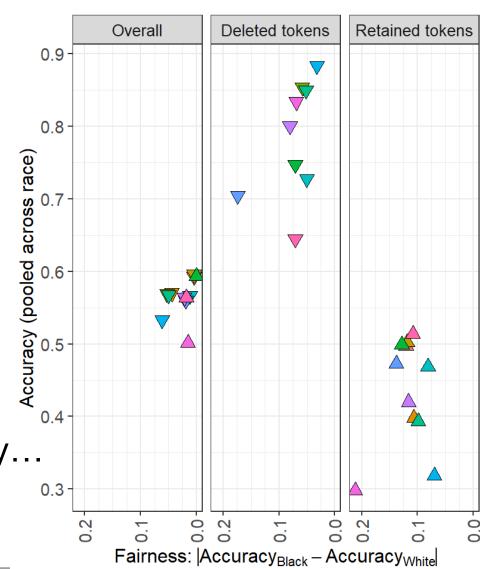
 \triangle Black

7 White

Fairness

- Acc_{Black} Acc_{White}
- Overall: 0.02–6pp
- Among deleted tokens: 3–17pp
 - Worse for White
- Among retained tokens: 7–21pp
 - Worse for Black

Hence my takeaway…



Implementation

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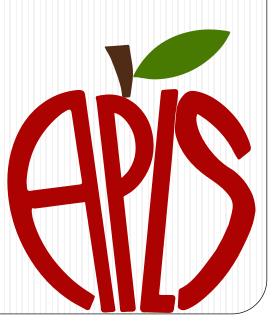
Disadvantaged group

- riangle Black
- White

Forced alignment-based auto-coding doesn't seem to work too good for coronal stop deletion

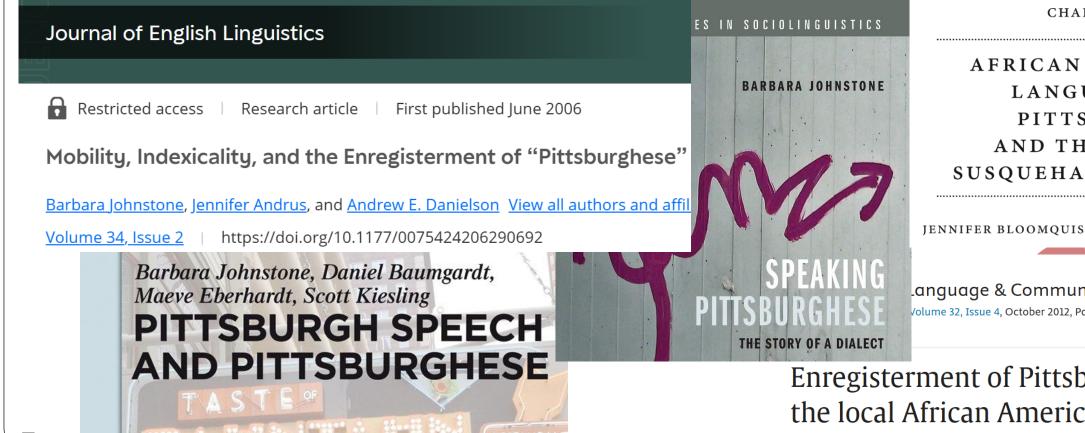
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Introducing APLS

 The Archive of Pittsburgh Language and Speech (APLS): a soonto-be publicly accessible corpus of Pittsburgh socioLx interviews



CHAPTER 12

AFRICAN AMERICAN LANGUAGE IN **PITTSBURGH** AND THE LOWER SUSQUEHANNA VALLEY

language & Communication Volume 32, Issue 4, October 2012, Pages 358-371



Enregisterment of Pittsburghese and the local African American community

Introducing APLS

- The Archive of Pittsburgh Language and Speech (APLS): a soonto-be publicly accessible corpus of Pittsburgh socioLx interviews
- Powered by LaBB-CAT corpus management framework (Fromont & Hay 2012)
- Currently: 33 hours of speech from 34 interviewees
 - 387K word tokens, 956K aligned segments
 - When complete: 45 hours from 40 interviewees
- Richly annotated with multiple layers of linguistic information
- Example: searching CSD tokens for speaker "HD06"

Thanks! Questions?

Thanks to Scott Kiesling, Barbara Johnstone, Robert Fromont, members of the Computational Sociolinguistics Lab past and present, and—most of all—the speakers who have shared their voices with us



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