

# EXPLORATION AND CLASSIFICATION OF VOCAL FRY, PERIOD DOUBLING, AND MODAL VOICE USING ACOUSTIC AND EGG MEASURES

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## I. OVERVIEW

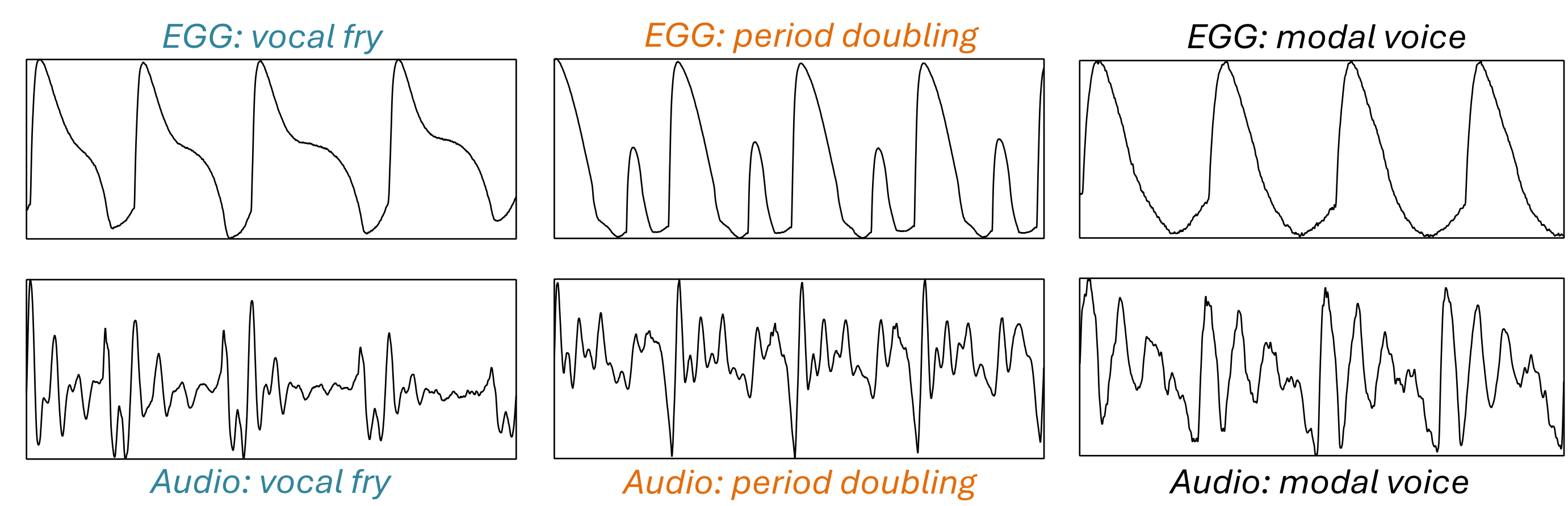
Creaky voice differs from modal voice in acoustic & phonatory properties, but how subtypes of creaky voice differ is less clear.

Existing classification of creak subtypes are mainly based on acoustic waveforms (Hedelin & Huber 1990, Redi & Shattuck-Hufnagel 2001)

**Q: How do subtypes of creaky voice differ in their acoustic and phonatory properties?**

Common acoustic attributes of creaky voice	Low f0	Low spectral tilt	Irregular f0	Others
prototypical	x	x	x	
vocal fry	x	x		damped pulses
period doubling	alternation	x		subharmonics
aperiodic		x	x	

After Keating et al. 2015, Huang 2022



**Goal: evaluate the importance of source and filter characteristics in distinguishing between vocal fry, period doubling (PD), and modal voice**

➤ Most important **acoustic** measures: **f0, H1-H2, H1, SoE, H2, H4, and HNR (0-500Hz)**

➤ Most important **phonatory** measures: **duration of the glottal opening phase and contact quotient** of the glottal pulse

## II. METHODS

- Simultaneous recordings of audio and electroglottography (EGG) of continuous read speech in Mandarin (Huang 2024)
- 20 university students (10F); 480 sentences/recording
- Fixed carrier sentence with varying trisyllabic words + picture fillers
- wo3 tǎu1 ni3 STIMULUS tsən3 mɿ5 ʃʷo1
- “I teach you how to say the STIMULUS.”

• Tokens of **vocal fry**, **PD**, and modal voice were located using EGG

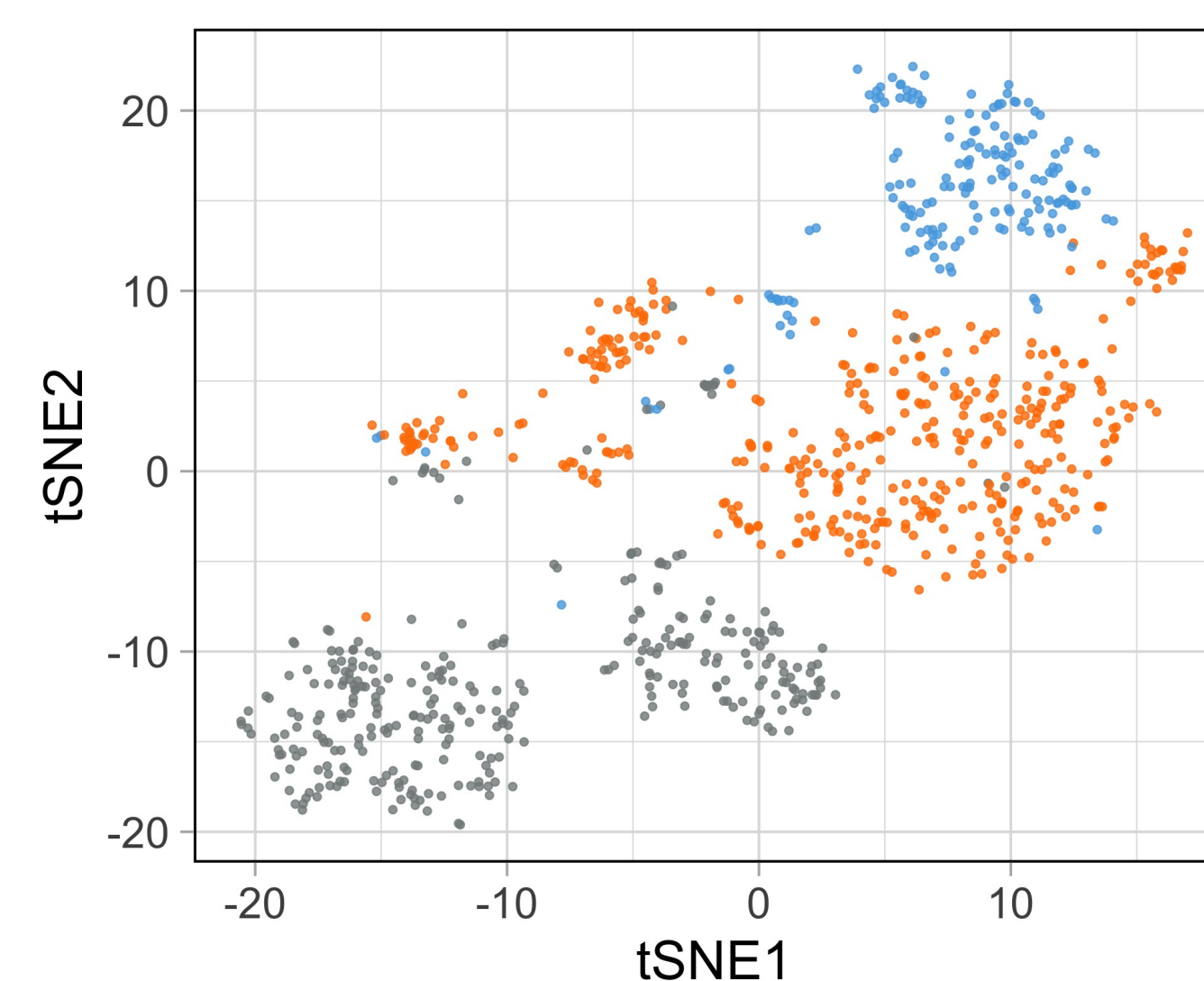
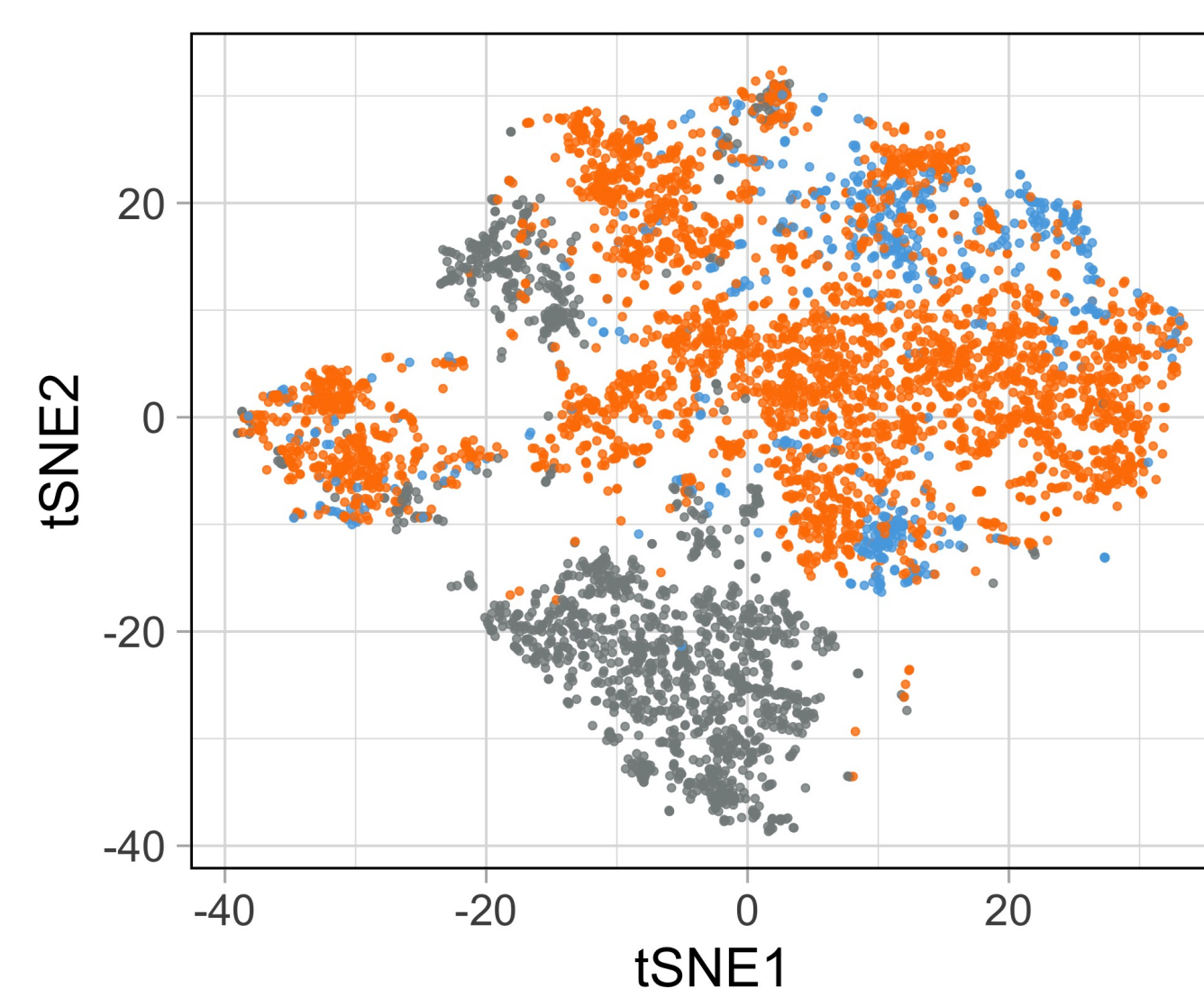
**32 acoustic & 11 EGG normalized measures** (VoiceSauce, EGGWorks):

- Harmonics & spectral tilts: e.g., H1\*, H2\*, H4\*, H2K\*, A1\*, A2\*, A3\*, H1\*-H2\*, H2\*-H4\*, H1\*-A1\*, H1\*-A2\*, H1\*-A3\*, H4\*-H2K\*
- HNRs, CPP, SHR (subharmonic-to-harmonic ratio)
- Formants & bandwidths; Energy measures
- Contact quotient (CQ), Cycle peak/minimum velocity/time, Speed Quotient (SQ); Contacting and opening duration

**t-SNE clustering & ML models:**

- Multinomial logistic regression with *l1* regularization (Lasso)
- Random forest model
- Cross-validation: 2/3 training & 1/3 test sets

## III. T-SNE CLUSTERING



Type • pd • fry • modal

Acoustics dataset

	Vocal fry	Period doubling	Modal
Women	482	2354	1175
Men	156	943	428
Total	638	3297	1603

5538 rows x 33 cols (gender coded as 0/1)

Acoustics + EGG dataset

	Vocal fry	Period doubling	Modal
Women	154	324	187
Men	25	91	137
Total	179	415	324

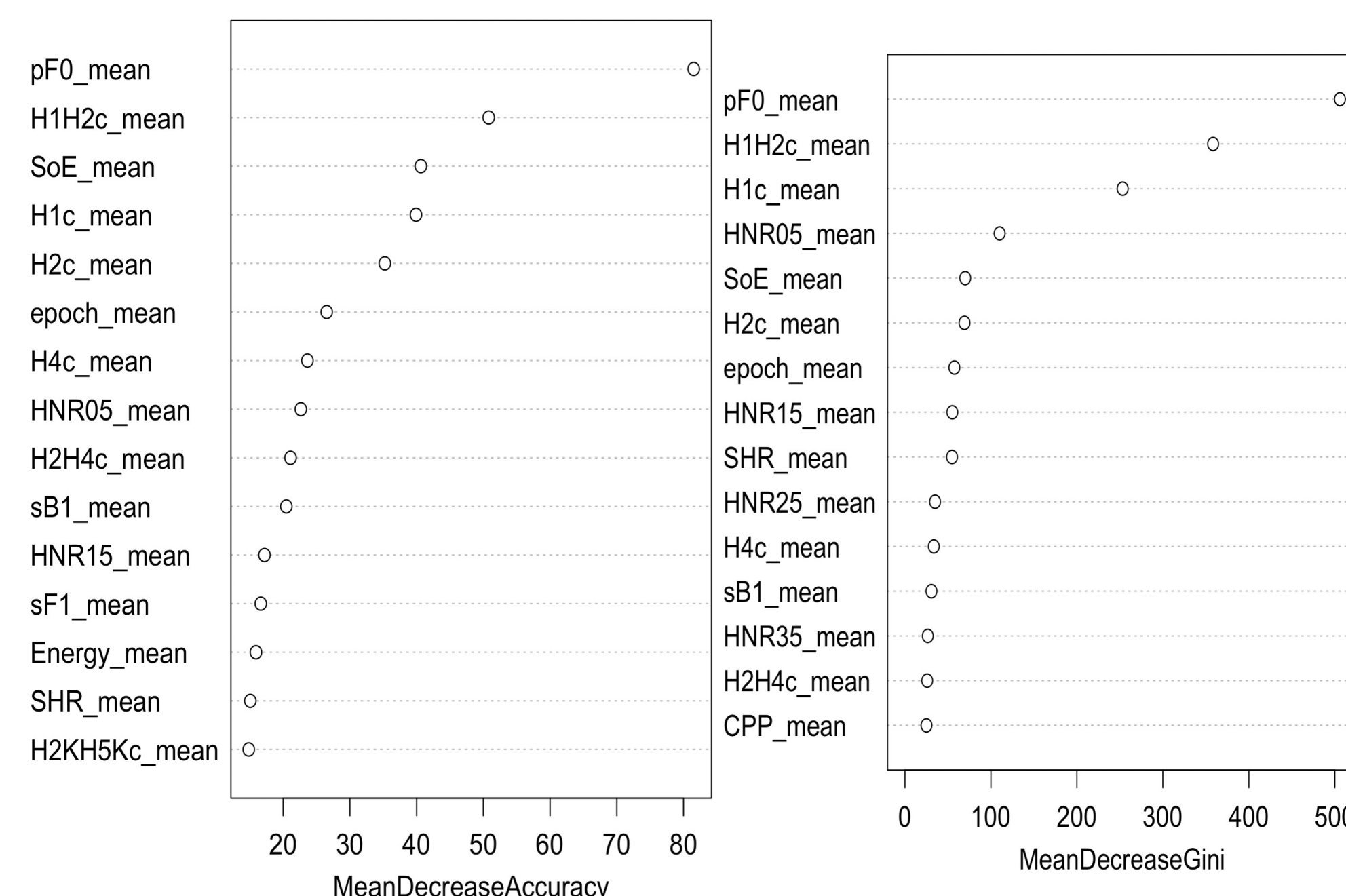
918 rows x 44 cols (gender coded as 0/1)

## IV. CLASSIFICATION RESULTS

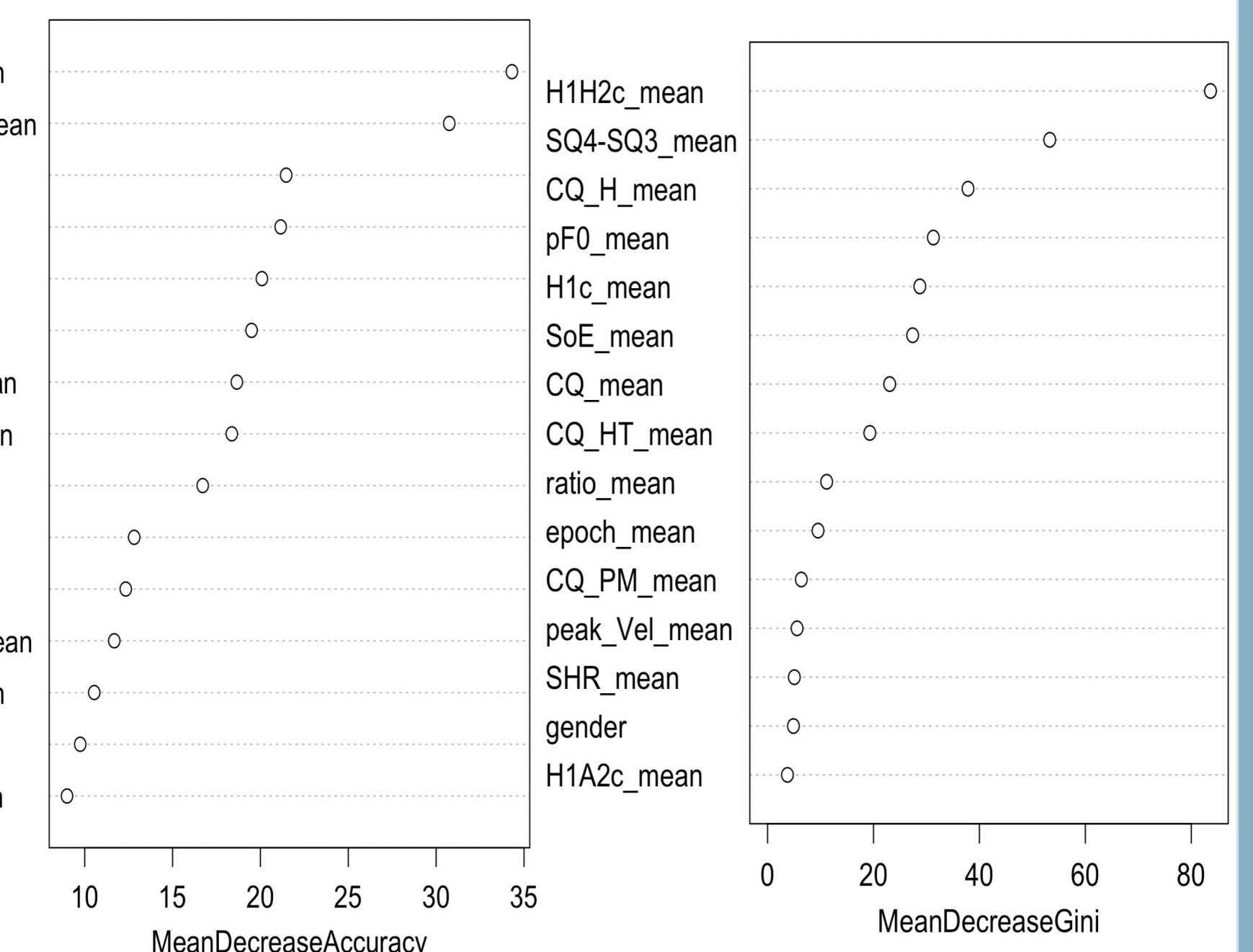
Accuracy, precision, recall scores in two datasets

Acoustic	Lasso regression	Random forest
Accuracy	0.9112	0.9312
Macro avg. precision	0.8749	0.9098
Macro avg. recall	0.8137	0.8529
Acoustic + EGG	Lasso regression	Random forest
Accuracy	0.9837	0.9967
Macro avg. precision	0.9840	0.9975
Macro avg. recall	0.9784	0.9970

Top 15 important acoustic measures



Top 15 important acoustic + EGG measures



## V. DISCUSSION & CONCLUSIONS

- Phonatory measures such as EGG contribute to the separation of subtypes of creaky voice
- Voicing types have stronger ties to the source dynamics associated with our vocal folds than the filter
- Mapping between perception and acoustics is direct, but what about phonatory characteristics? How are they accessible to listeners?

## REFERENCES

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