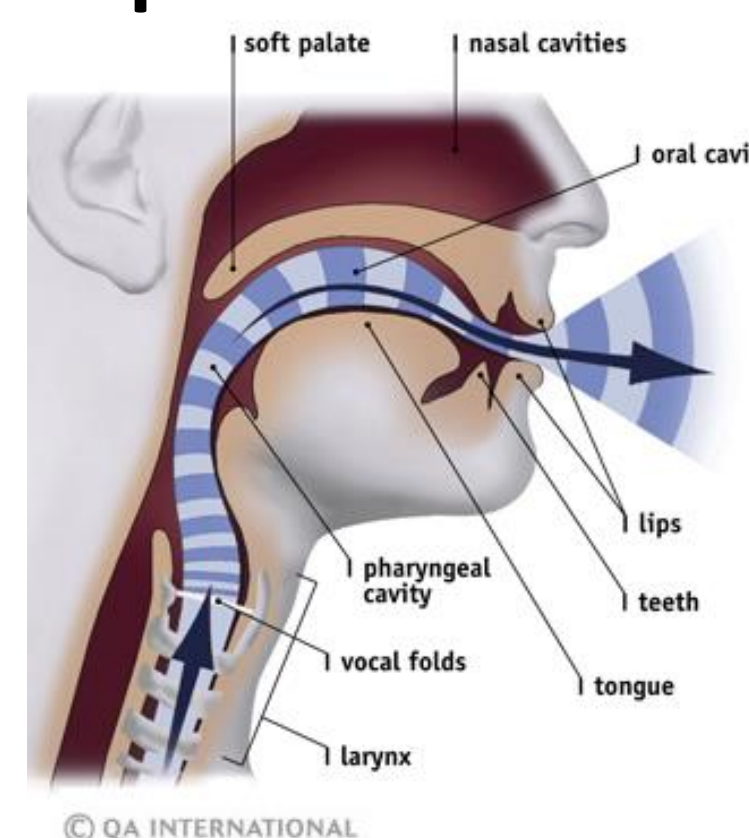


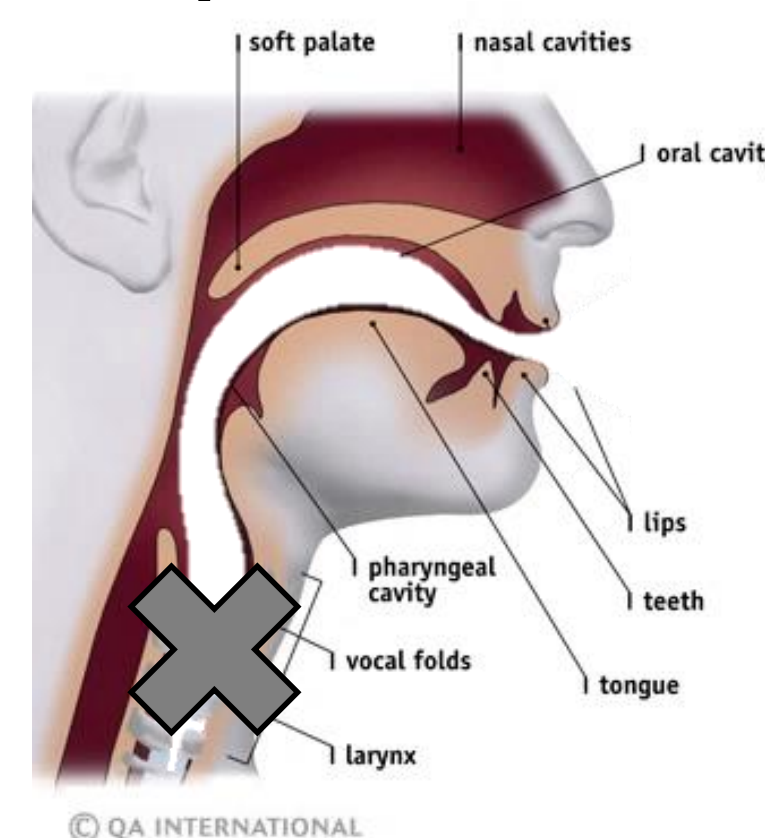
## Background

### Natural Speech Vocalization



- Air pressure from lungs
- Frequency (pitch) variation from larynx
- Auditory filtering from tongue, cheeks, lips, etc.

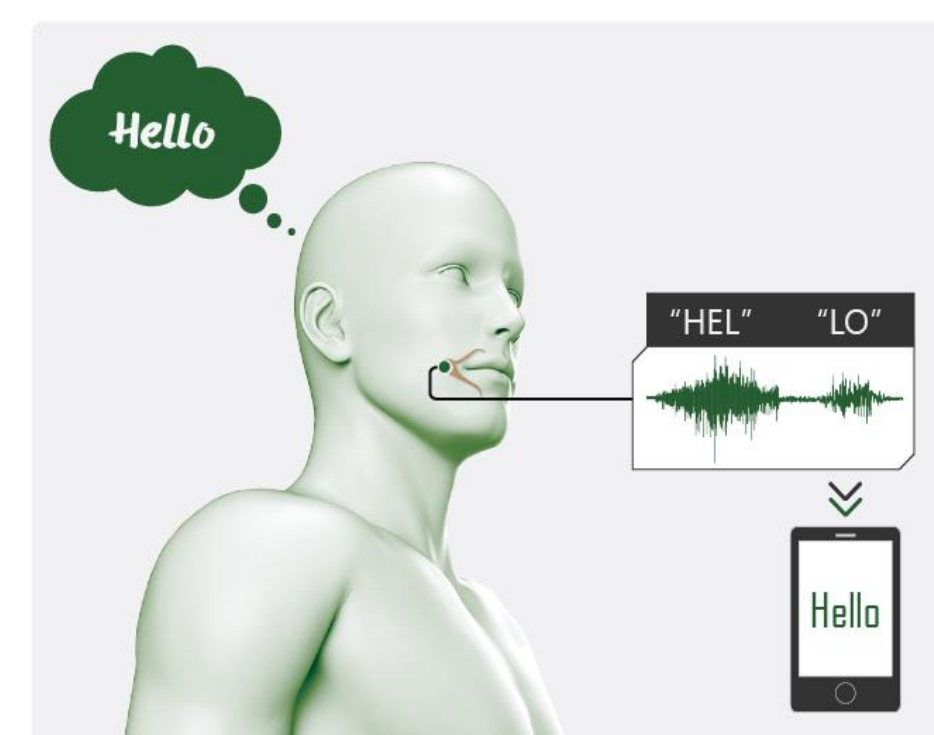
### Impaired Speech Vocalization



- 60,000 cases of cancer in mouth, throat and larynx each year in US
- Most result in vocal impairment
- In such cases, speech musculature still remain intact and can provide an Alternative Speech source

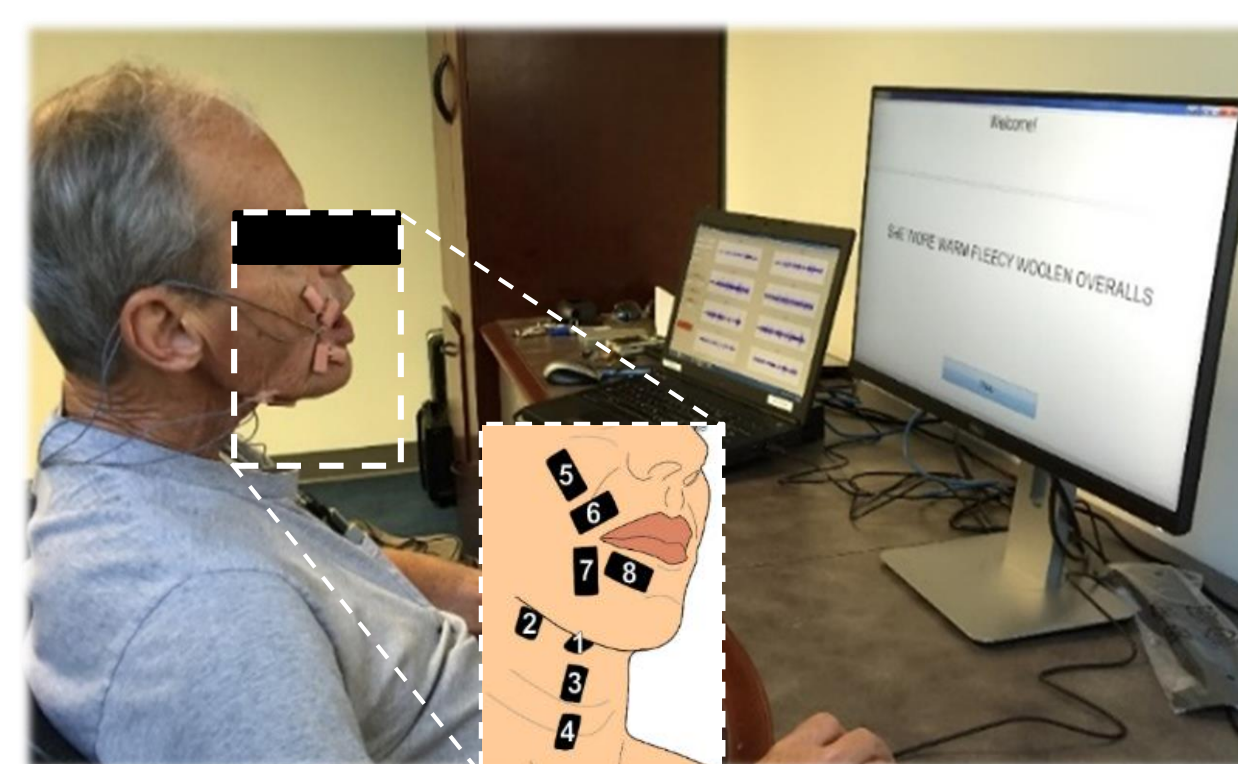
## Objective

To provide sEMG-based Subvocal Speech Recognition platform that utilizes silently mouthed (subvocal) speech for Augmentative and Alternative Communication (AAC).



## Methods

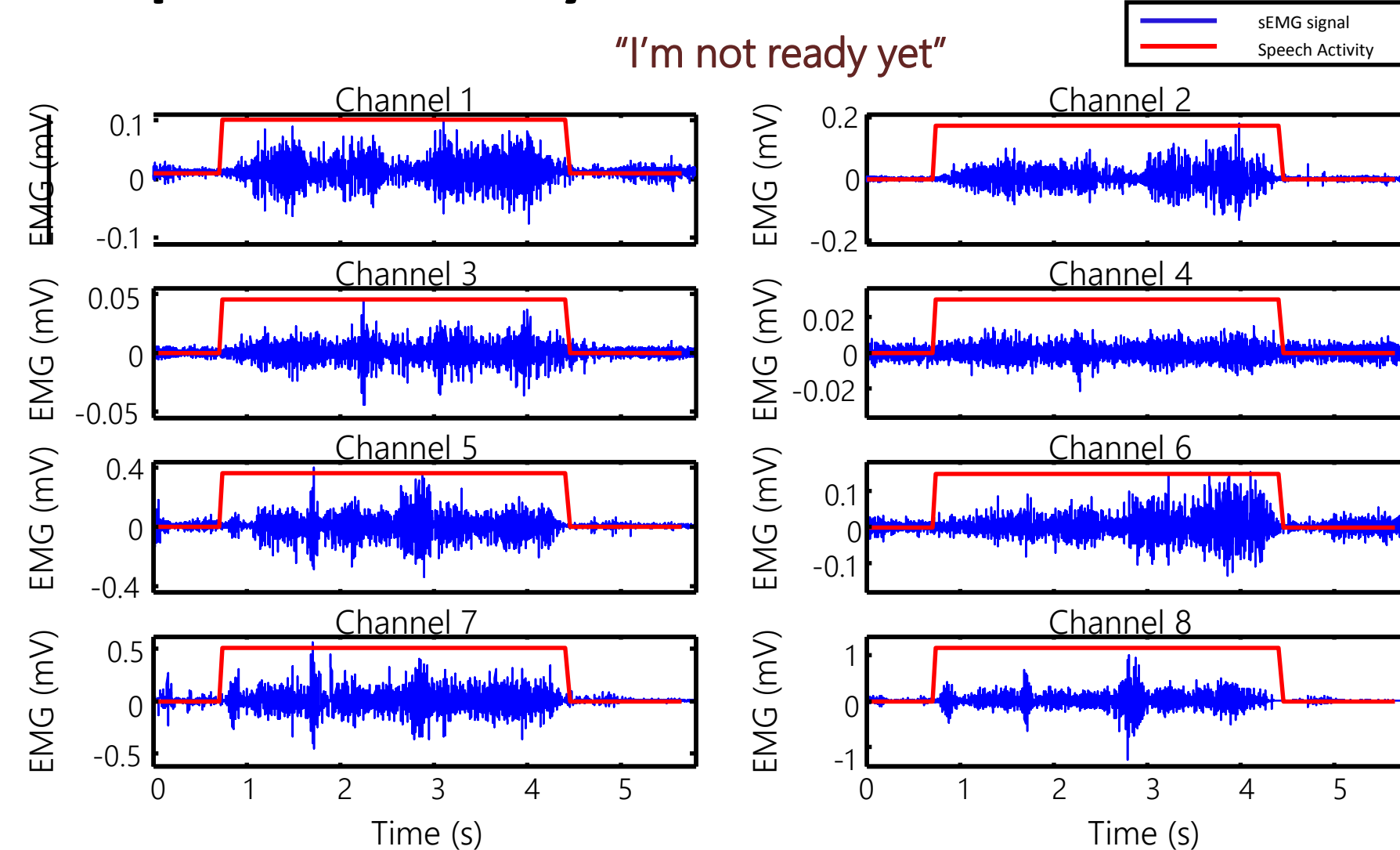
### Experiment Setup<sup>1</sup>



### Data Collection

Subject Population	n = 7 Total Laryngectomy
Sensor Type	Trigno wireless sEMG (Delsys, Inc)
Sensor Location	1,2 Neck – submental 3,4 Neck – ventromedial 5,6 Face – supralabial 7,8 Face – infralabial
Data Corpus	2500 words/ 980 continuous sentences

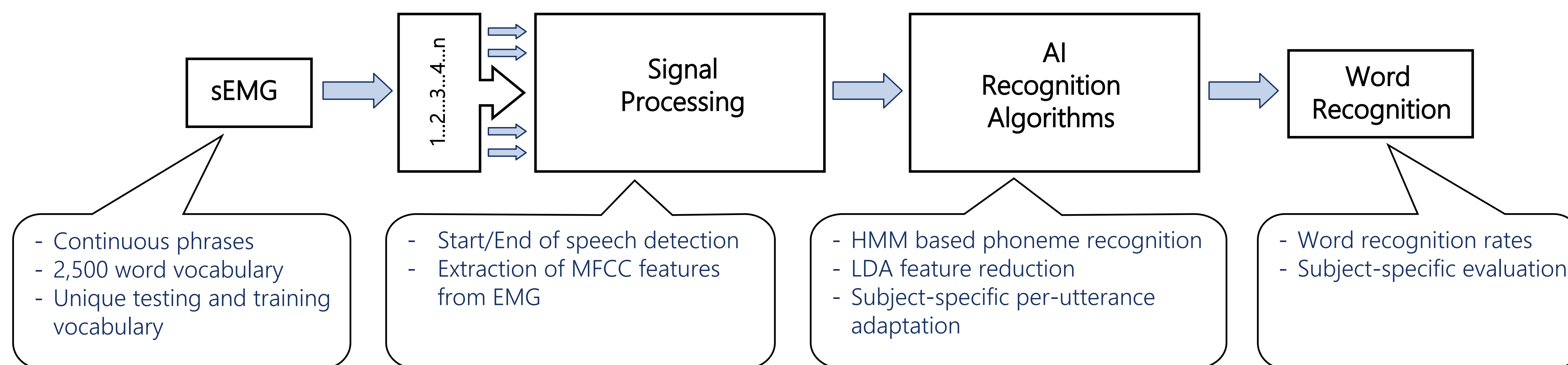
### Speech Activity Detection<sup>2</sup>



- Unique EMG activation across muscles
- Separated speech from non-speech activity by identifying simultaneous multi-channel activation
- Robust against single channel noise

## Subvocal Algorithm Architecture

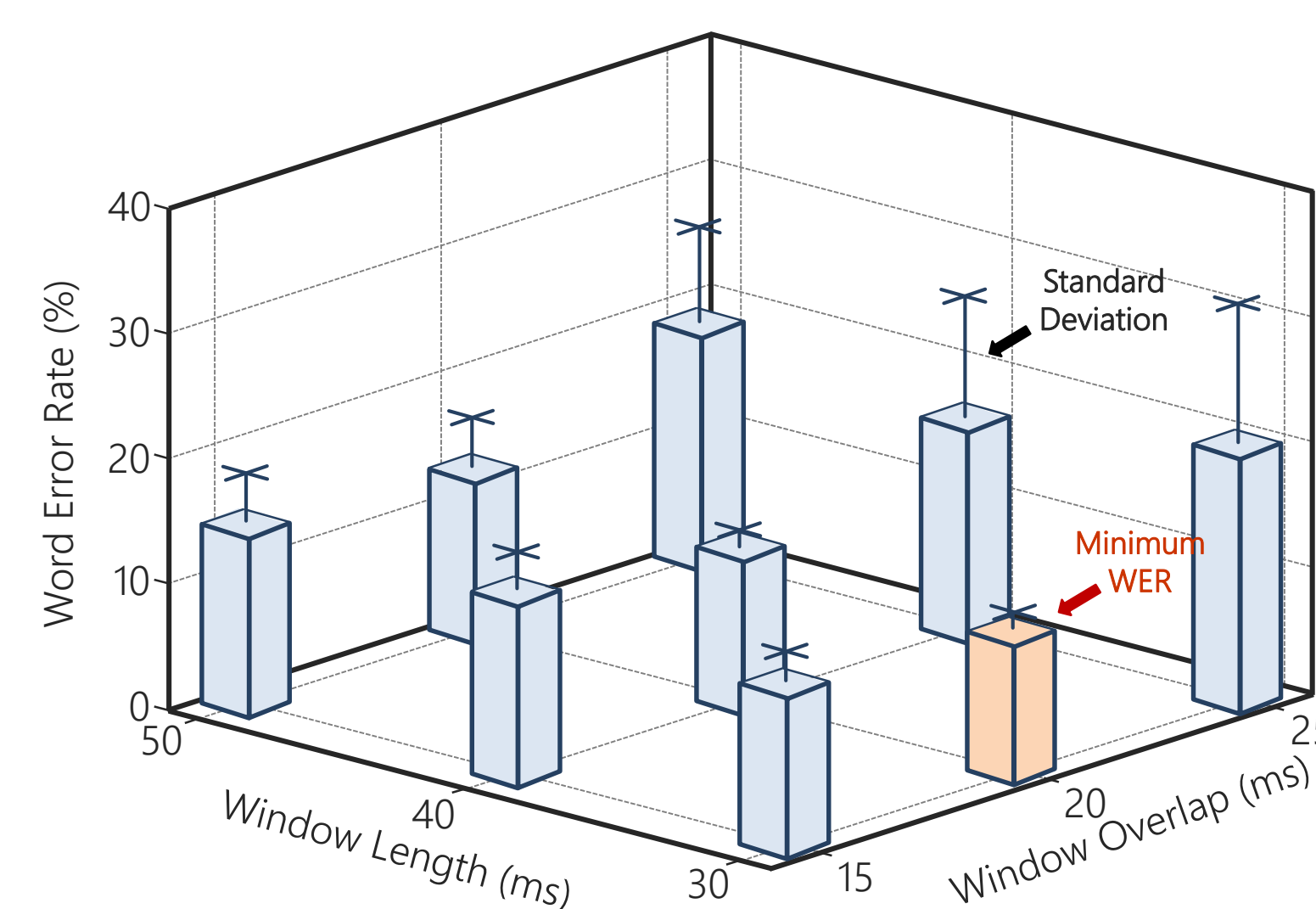
### Front-end Signal Processing + Back-end Machine Learning



## sEMG Speech Performance Findings

### Key Finding 1

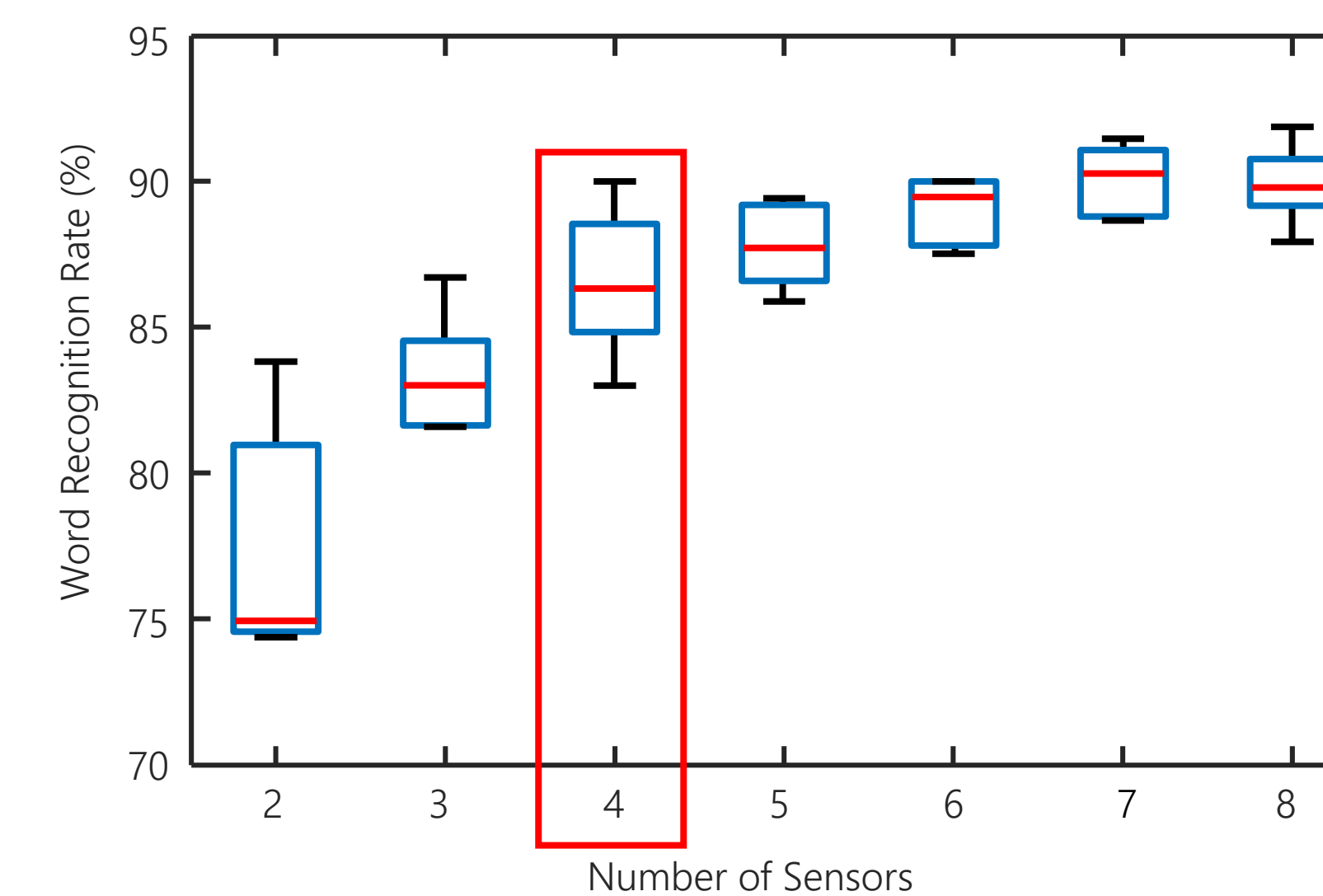
#### Average WER as a function of Window Length, Overlap (ms)



- Word Error Rate (WER) is highly influenced by window lengths and overlaps selected
- Most effective Window/Overlap pair: 30ms/20ms
- Mean WER at 30ms/20ms: 11.4%

### Key Finding 2

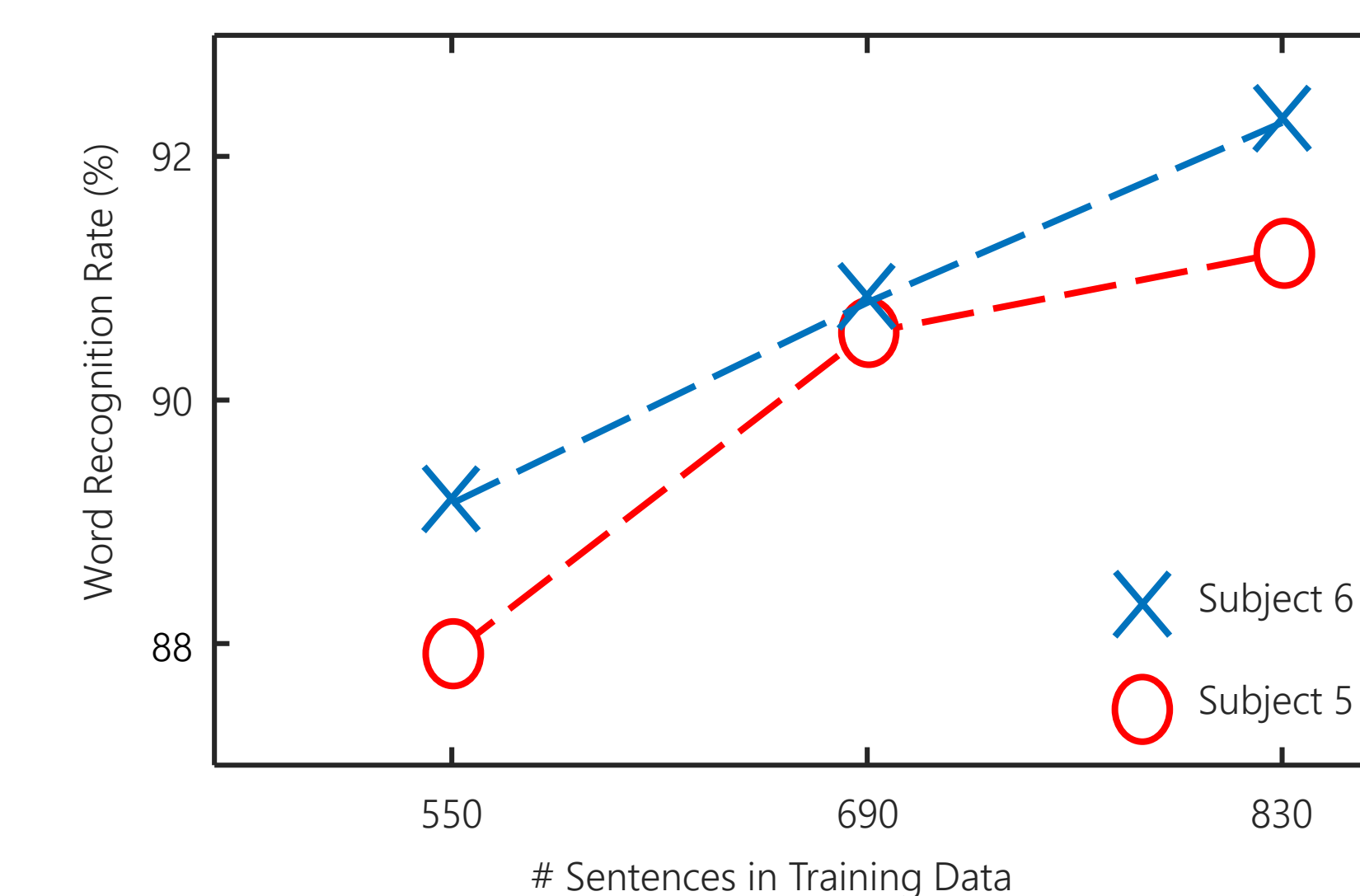
#### Word Recognition as a function of the Number Sensors



- Increase in number of sensors is exponentially related to increase in Word Recognition
- Optimal number of sensors for facially worn interface: 4

### Key Finding 3

#### Word Recognition vs Training Data



- Word Recognition improves with increase in number of sentences used for training
- Training data expansion has potential to improve subvocal speech recognition

## Conclusion

- Proof of concept of first sEMG –based subvocal speech recognition system that provides 85-90% WERs for continuous speech from 2500 word vocabulary
- Restores sense of embodiment & intuitive speech by augmenting natural voice musculature
- With larger data corpus and optimal parameters guided by key findings, this technology has the potential to provide AAC that approximates natural speech vocalization

## Acknowledgements

- VocalID, Inc. Belmont, USA
- MGH Voice Center, Boston, USA
- BAE Systems, Inc. Burlington, USA

## Support



## References

1. Meltzer et. al. Transactions on Audio, Speech and Language Processing, 2016
2. Meltzer et. al. Annual International Conference of the IEEE EMBS, 2011