

# **SPEECH ANALYSIS**

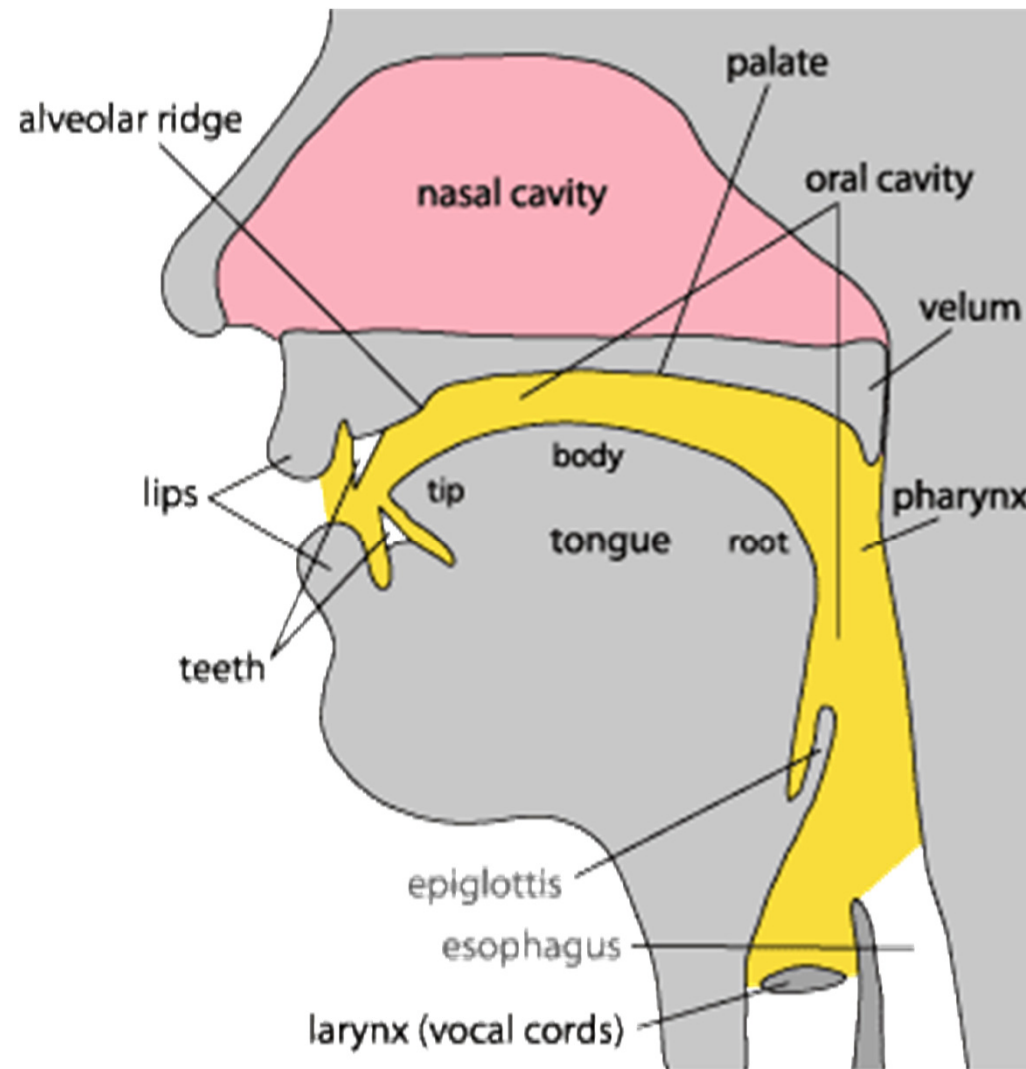
**Jon Gudnason**

# OVERVIEW

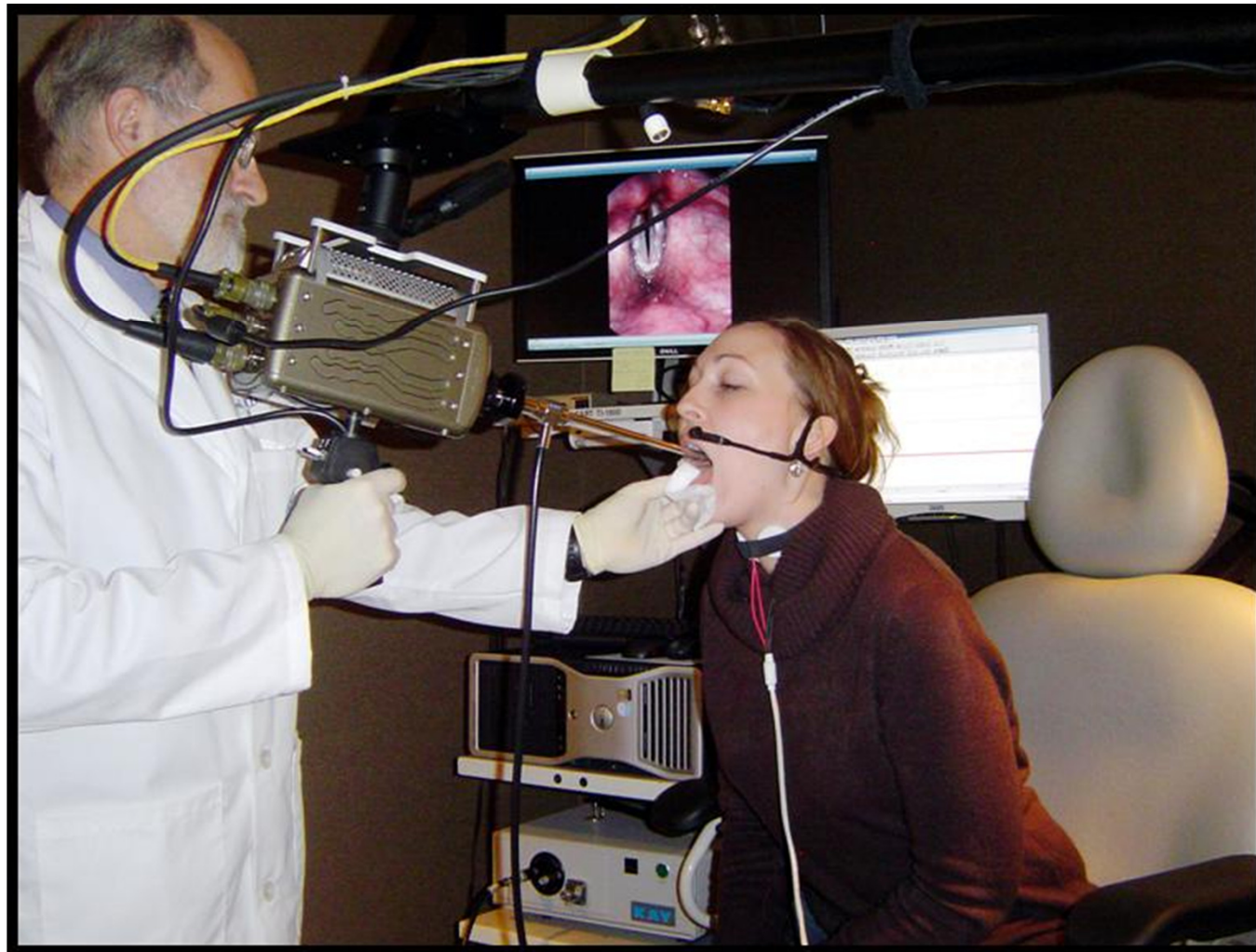
- Acoustic Speech Processing
- Speech Feature Extraction
- Speech Recognition with HMMs
- Hearing and Human Speech Recognition



# PHYSIOLOGY OF SPEECH



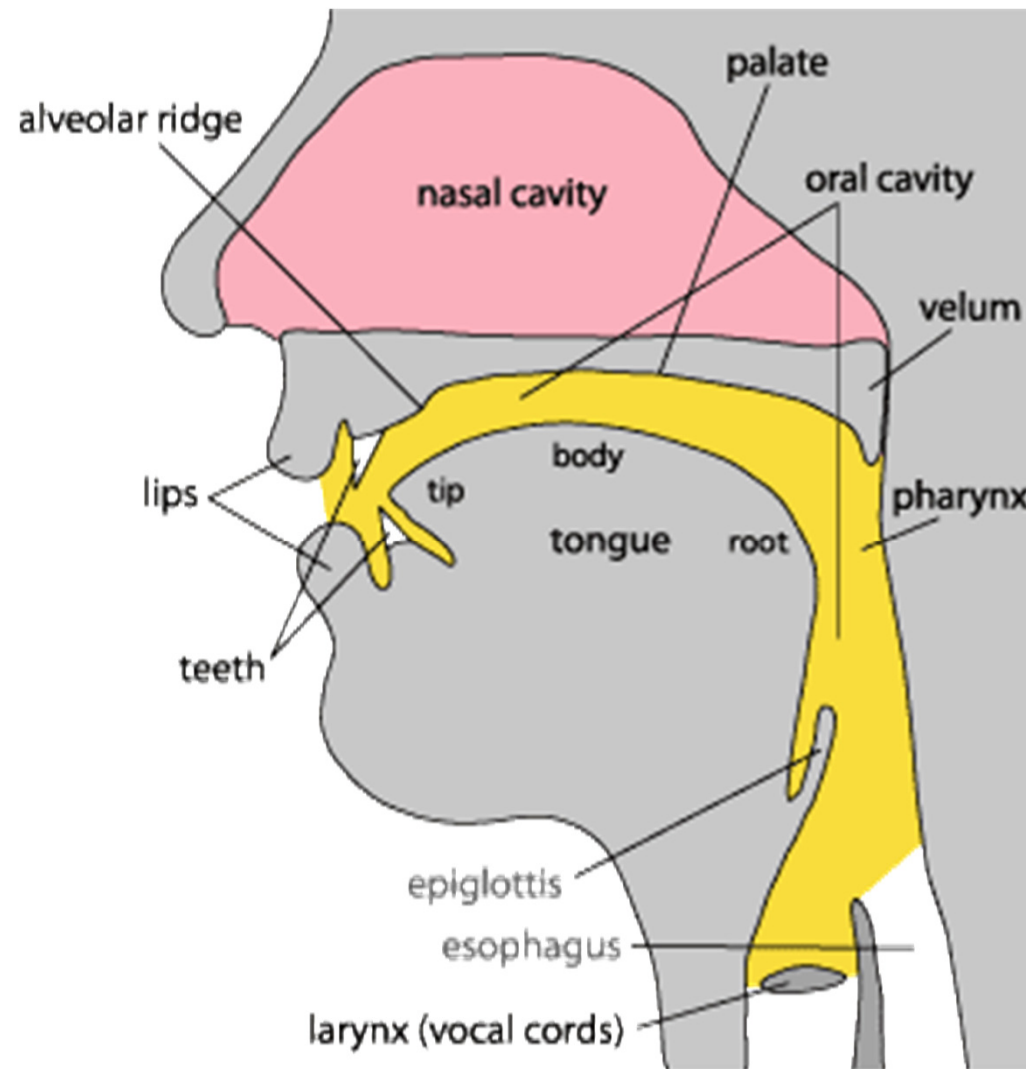
# VIDEO ENDOSCOPY



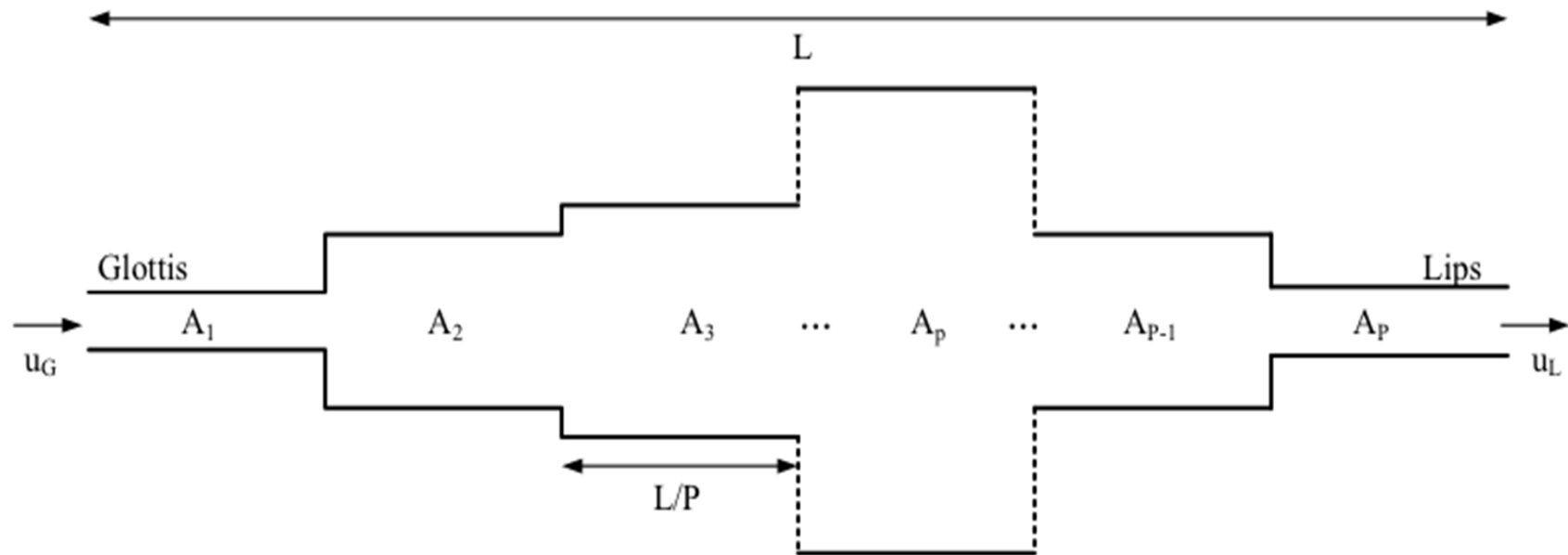
# VOICE SOURCE – VIDEO ENDOSCOPY



# PHYSIOLOGY OF SPEECH



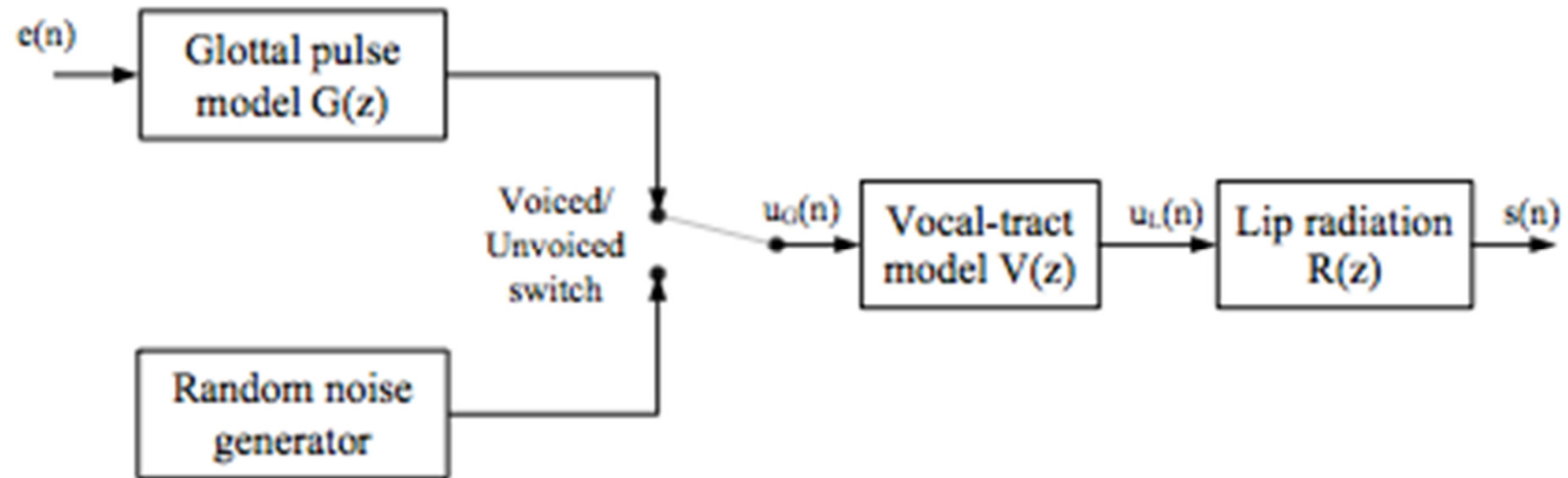
# LOSSLESS TUBE MODEL



$$V(z) = \frac{z^{-P/2} K_V}{1 - \sum_{p=1}^P a_p z^{-p}}$$



# MODEL OF SPEECH PRODUCTION

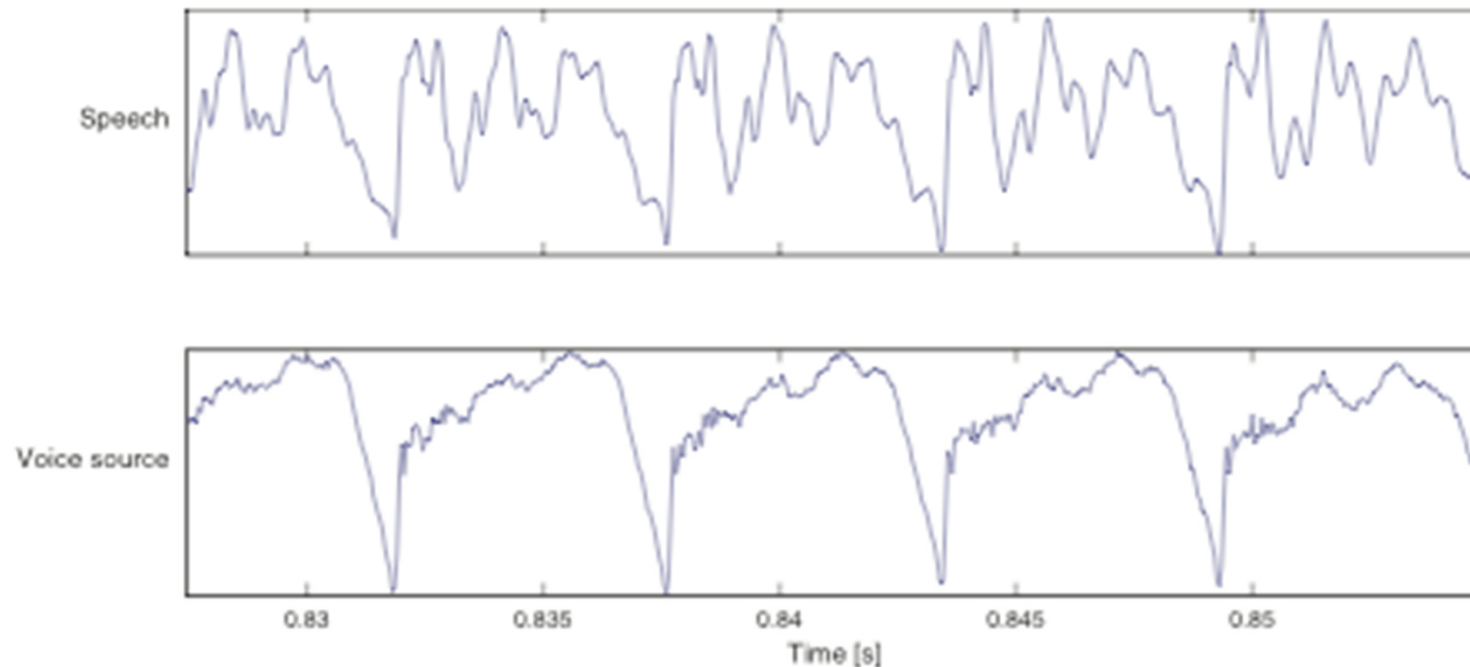




# VOICE SOURCE

- Extracted voice source using inverse filtering

$$s(n) = u_d(n) + \sum_{k=0}^p a_k s(n - k)$$



# SPEECH SPECTRUM

- Fourier Analysis applied to the speech signal:

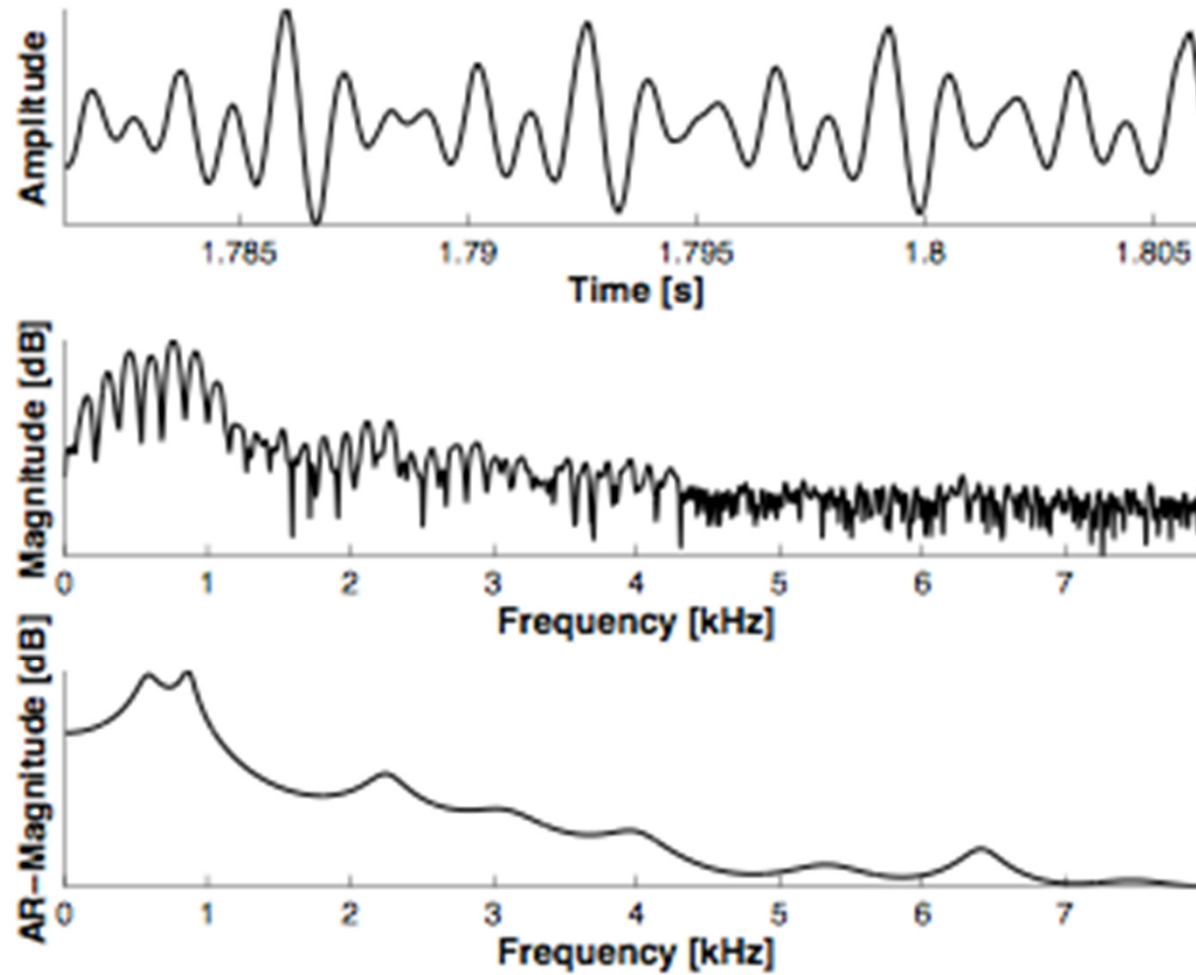
$$S(k) = \sum_{n=1}^{N-1} s[n] e^{\frac{-j2\pi}{N} kn}, \quad k = 0, 1, \dots, N - 1$$

- Compare this to the envelope of  $V(z)$

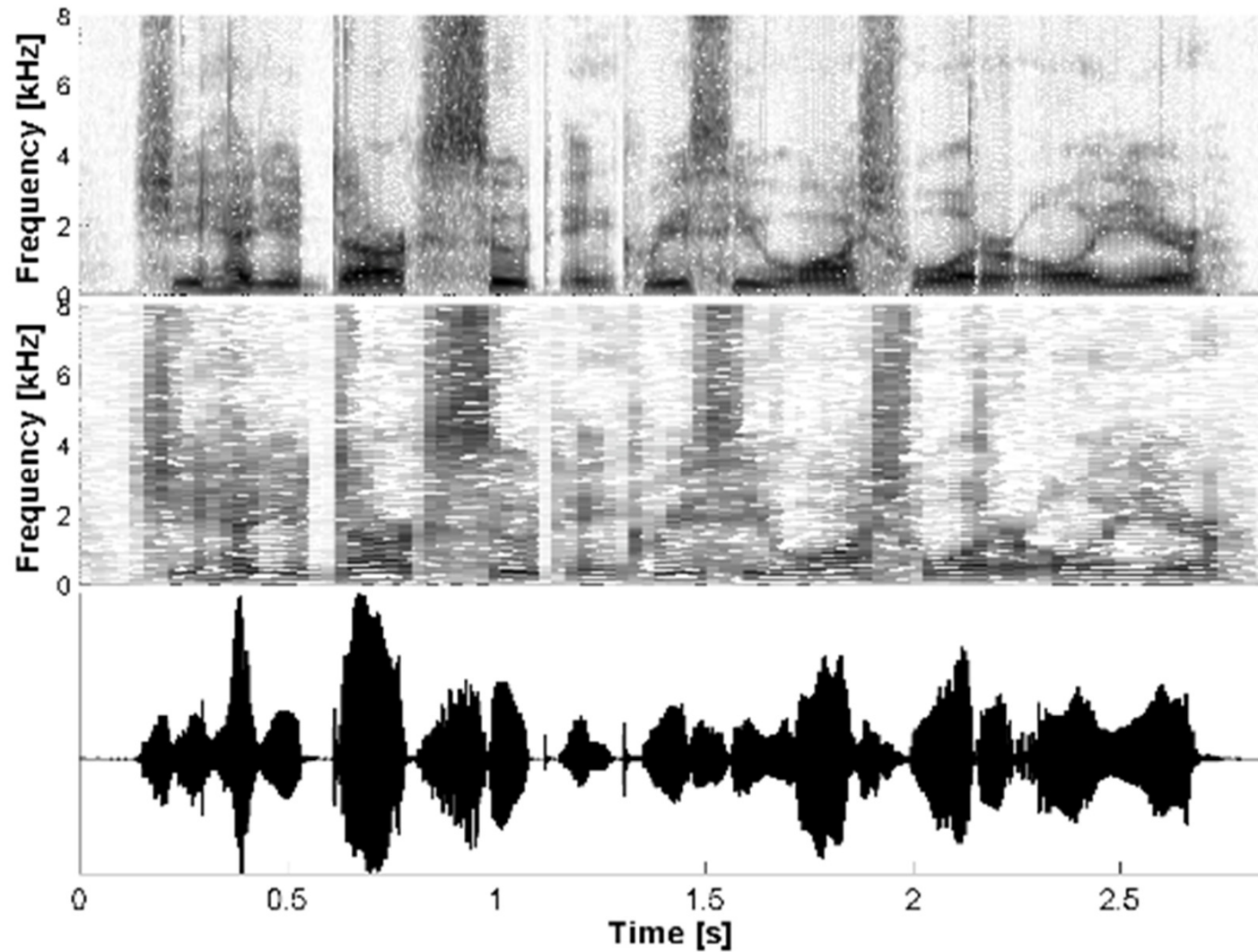
$$|V(k)| = \left| \frac{1}{1 - \sum_{p=1}^P a_p e^{-j2\pi kp/N}} \right|$$



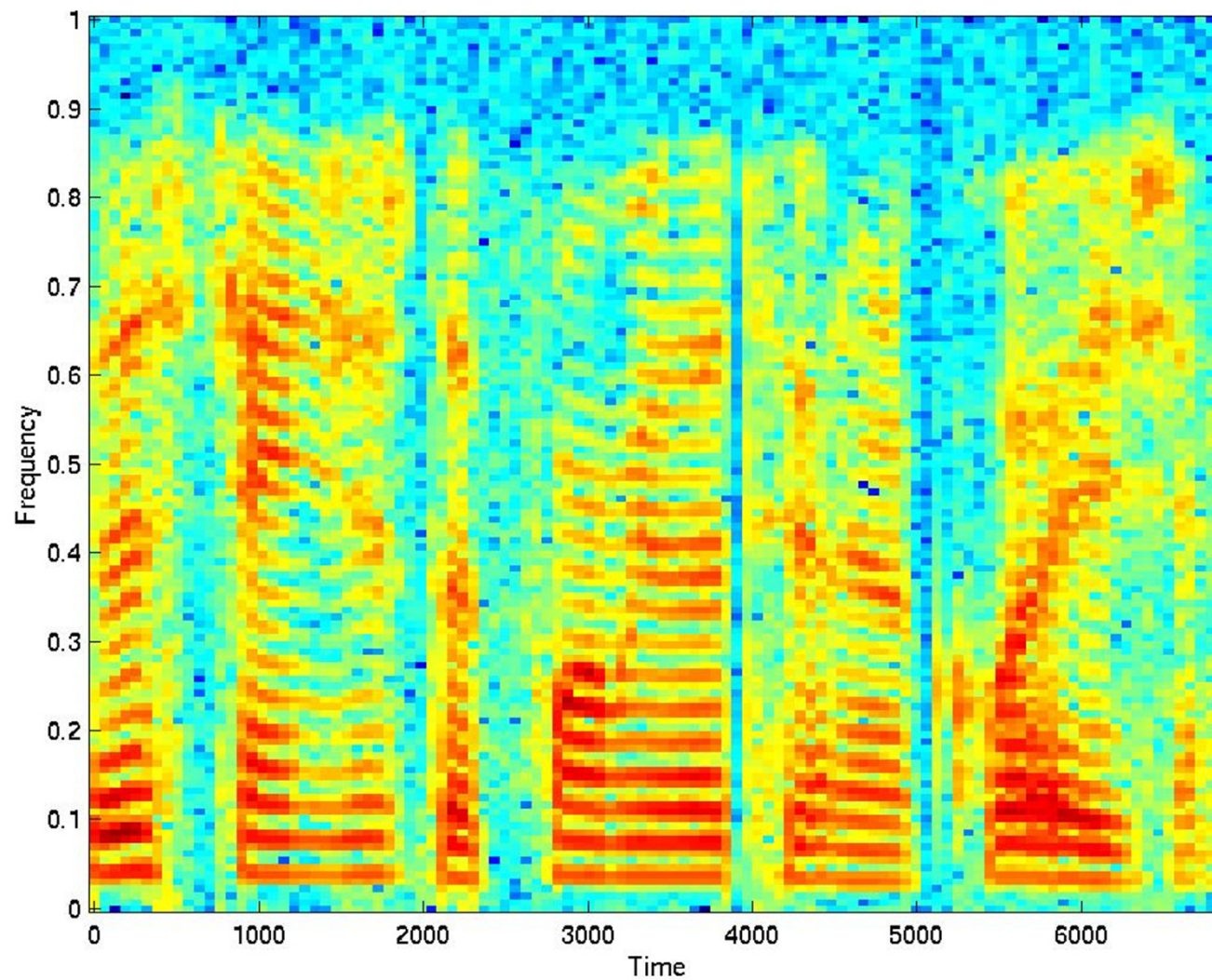
# SPEECH SPECTRUM



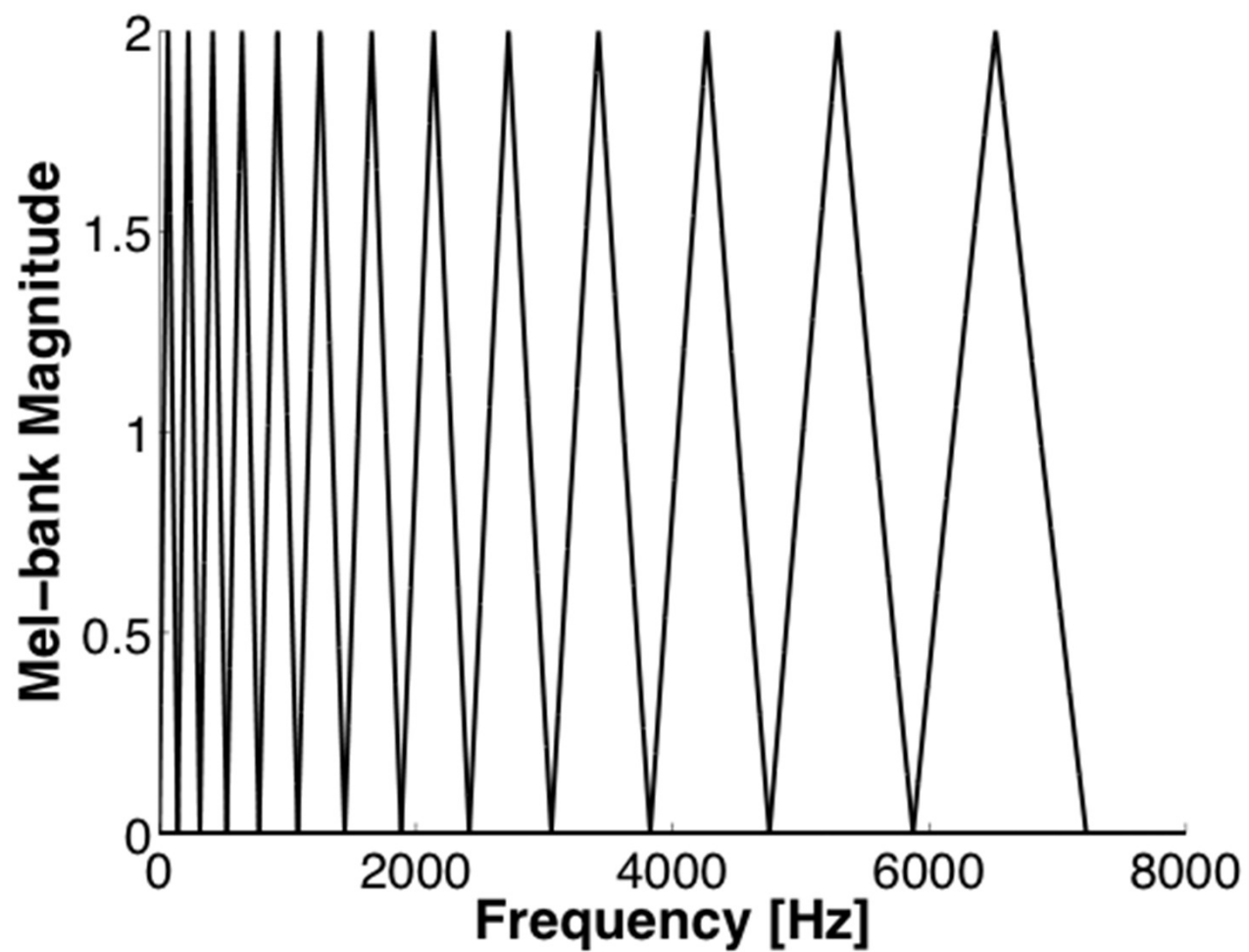
# SPECTROGRAM



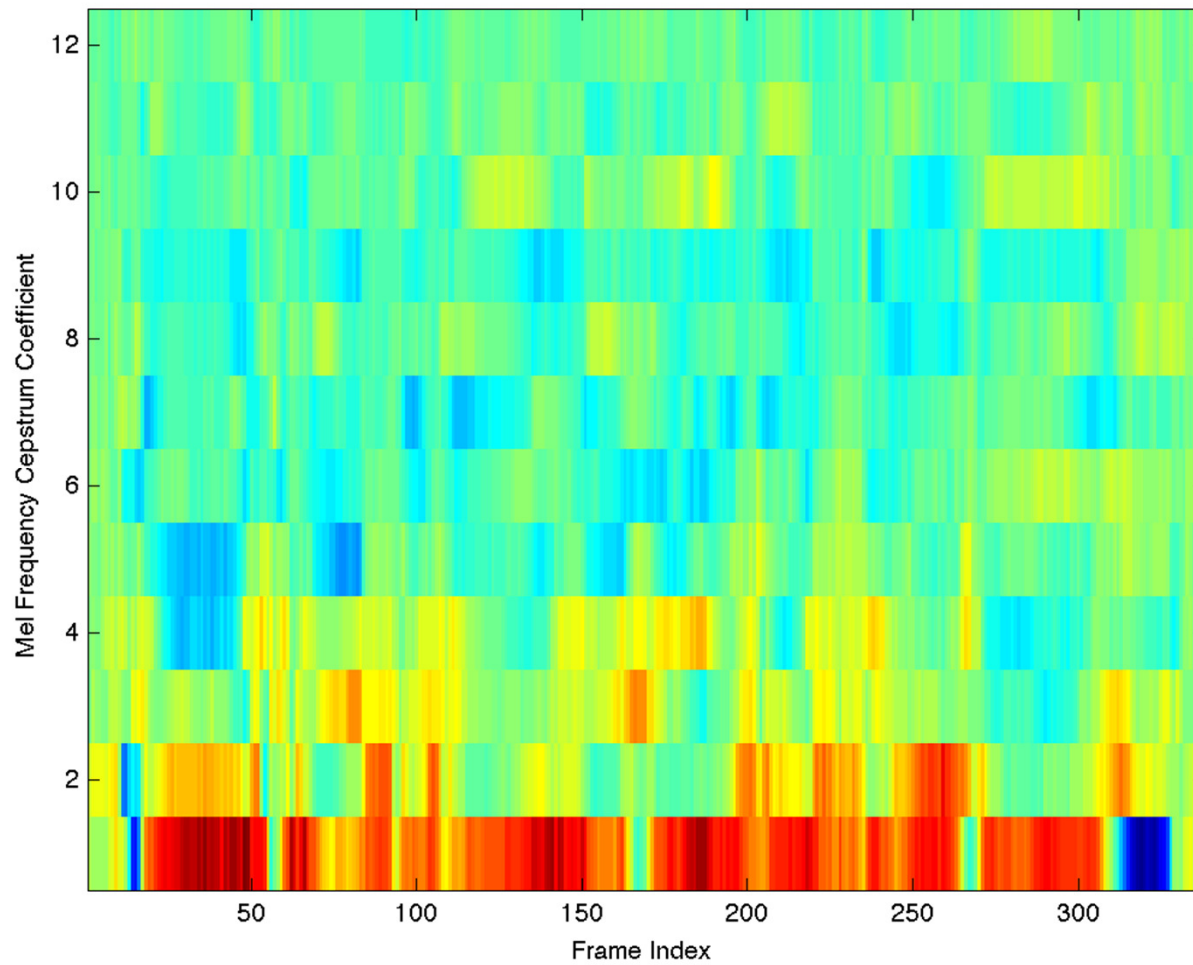
# SPECTROGRAM OF SPEECH



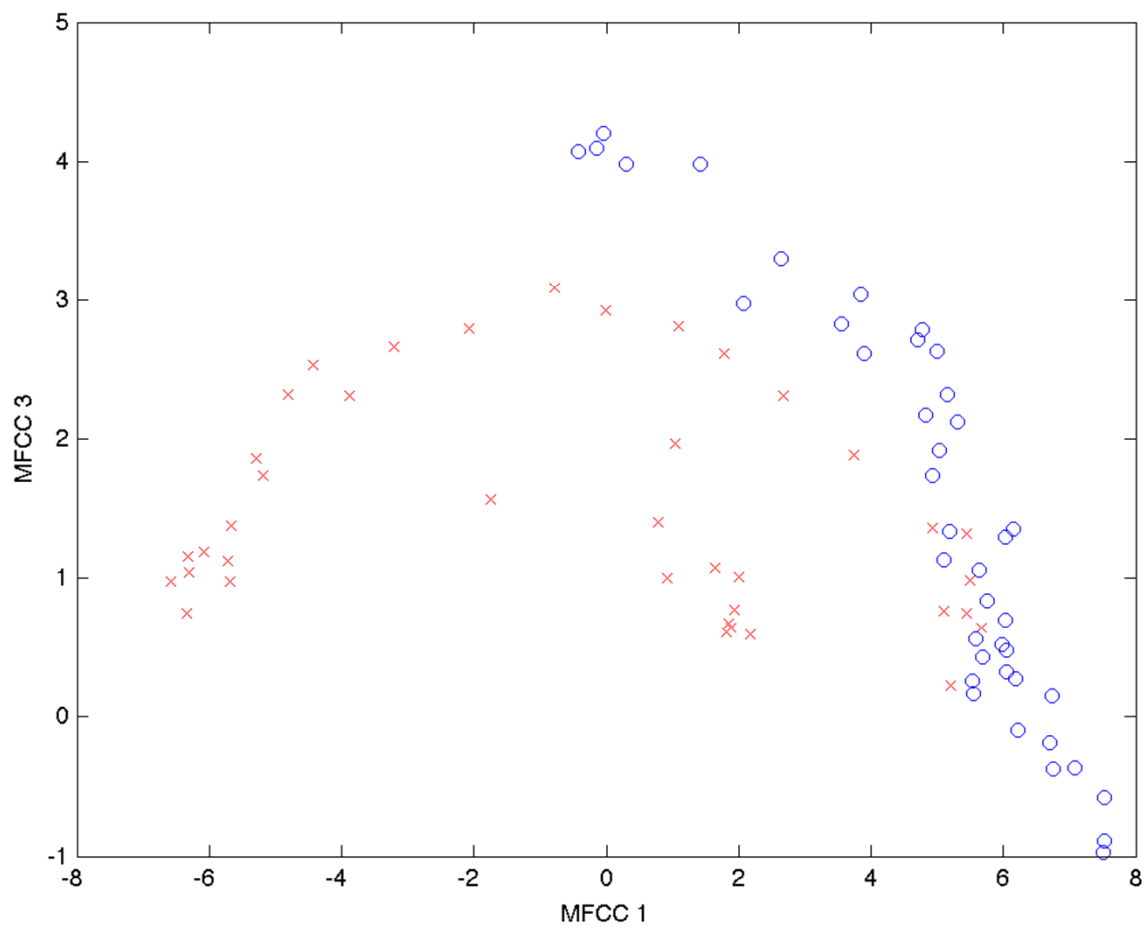
# SPEECH FEATURE EXTRACTION



# MEL-FREQUENCY CEPSTRUM COEFFICIENTS

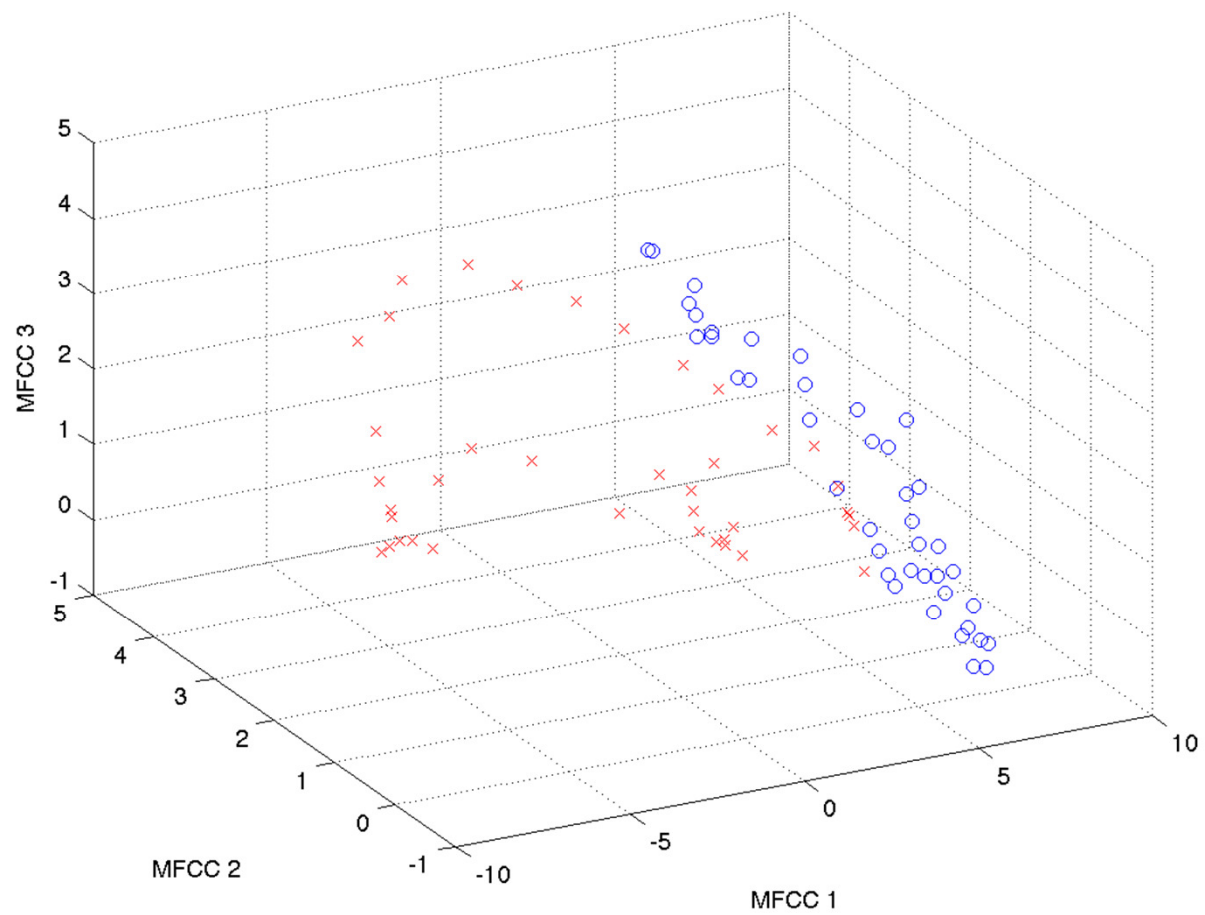


# FEATURES SCATTER PLOT



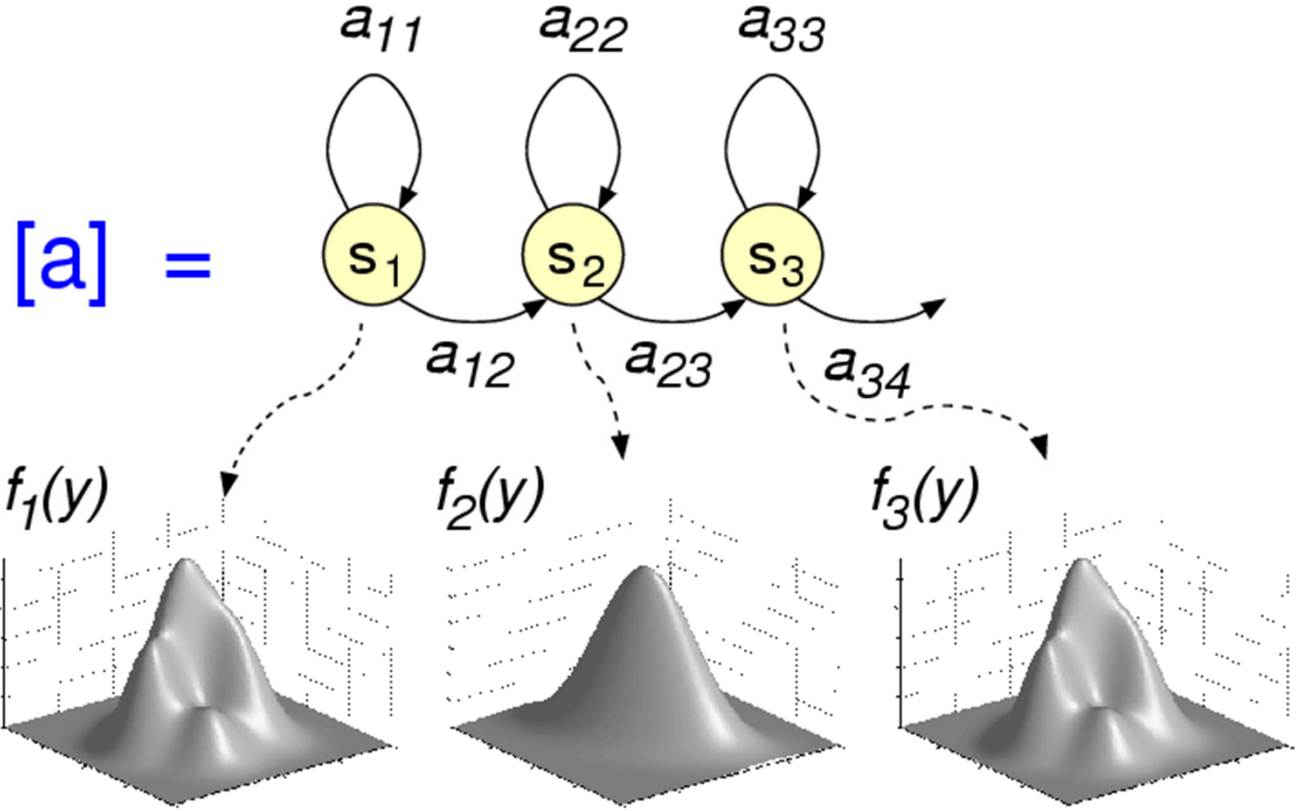


# FEATURES SCATTER PLOT



# CONNECTION TO HIDDEN MARKOV MODELS

## Hidden Markov Models



# THREE TASKS OF HMMs

- Evaluation
  - What is the probability that this observation was generated by the model?
- Decoding
  - What is the most likely state sequence in the model that produced the observation
    - Viterbi, A\* algorithm
- Learning
  - How should we adjust our model parameters given observation sequences
    - Baum Welch algorithm (special case of Expectation maximization, EM)



# HEARING AND HUMAN SPEECH RECOGNITION

- If we understand how hearing works we can:
  - Compress speech more efficiently
  - Imitate the functionality of hearing in speech processing
  - Examples: The Mel- and Bark scales
- Human speech recognition
  - Telecommunications
  - Psychoacoustics

