Speech recognition and synthesis

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Introduction

Speech recognition in Human Machine interaction

- A full interaction requires human input
- Input with speech is often faster and easier than with text or pointers
 - Over the phone
 - With large or unlimited choice, eg, person and place names
 - Free text, eg, dictation messages
 - With hands occupied, eg, while driving
- Sometimes speech input is ineffective
 - In a noisy surrounding, eg, a train station
 - With small menu based selections
 - Large variation in speakers, eg, second language speakers
 - Tasks that are difficult to describe verbally, eg, routing on a map

Many pictures (and their copyrights) are from [Jurafsky and Martin(2000)]



Automatic Speech Recognition



ASR is a database retrieval problem

- A speech recognizer is a clever example database
- The problem is: How to retrieve the most likely words from the acoustic signal
- Break down into two problems: Get the most likely
 - word candidates given the sound
 - word sequence given the available word candidates
- Currently both problems are solved stochastically

and the

Speech Input: How to partition the ASR problem

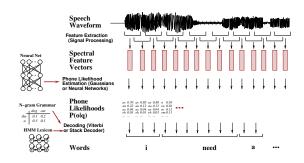
What is the most likely word sequence given the observed sound:

Split this into two separate tasks

- P (Observation) is a normalization constant, independent of word recognition (ignore it)
- P (Observation | Words) is the acoustic likelihood of the words
- P(Words) is the *prior* of the word sequence (i.e. the language model)



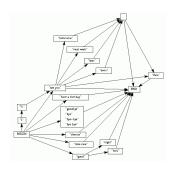
Speech Input: An overview of ASR



Sound waveform to word sequence

- Encode the waveform into Spectral Features
- Determine word likelyhoods *P* (*Sound* | *Words*) for each word
- Determine word sequence probability P(Words) for each sequence

Language Prior: P (Words)



Farewell Finite State example

every arrow has a probability

- The probability of observing an utterance
- Example from http://www.geocities.com/SoHo/Square/3472/nounphrase.html

Language Prior: Word sequences

Estimate P(Words) =

$$P(w_1,...,w_n) = \prod_{i=1}^n P(w_i|w_1...w_{i-1})$$

Approximate P(Words) by modelling $P(w_i|w_1...w_{i-1}) \approx$

- $P(w_i|State_{\alpha})$: Finite State Grammar
- $P(w_i|w_{i-n+1}...w_{i-1})$: N-gram
- $\sum_{\alpha} P(w_i | Tree_{\alpha}(w_1 \dots w_{i-1})) \cdot P(Tree_{\alpha}(w_1 \dots w_{i-1}))$: Context Free Grammar with (lexicalized) tree structures build from $(w_1 \dots w_{i-1})$



Language Prior: N-grams

Collect word, word-pair and word-triplet frequencies [Goodman(2001)]

- Impossible to get frequencies of all possible bi/trigrams
- Construct smoothed probability distributions
- Special "states" for sentence start and "end"
- $P(Words) \approx P(w_i|w_{i-2},w_{i-1})$
- Use interpolation or backoff, eg, $P(w_i|w_{i-2},w_{i-1}) \approx \alpha \cdot P(w_i|w_{i-1})$ if the tri-gram (w_{i-2},w_{i-1},w_i) was not observed





Language Prior: Data Oriented Parsing (CFG Example)



Fig. 1. A toy treebank

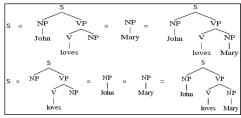


Fig. 2. Two different derivations of the same parse

Subtree have occurrence and insertion probabilities

- Requires a treebank with frequencies
- Correct normalization of probabilities
- Computationally expensive, like all probabilistic CF parsers

Language Prior: Grammar Perplexity

Perplexity
$$(\mathfrak{G}) = 2^{H(\mathfrak{G})}$$

where

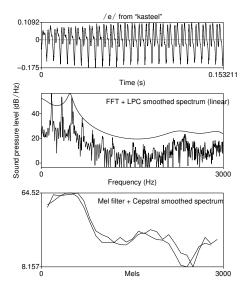
$$H(\mathfrak{G}) = \sum_{w_i} -P(w_i|w_1...w_{i-1}) \cdot \log_2 P(w_i|w_1...w_{i-1})$$

For a tri-gram grammar this corresponds to:

- $P(w_i|w_{i-2},w_{i-1}) = \frac{P(w_{i-2},w_{i-1},w_i)}{P(w_{i-2},w_{i-1})}$
- Perplexity corresponds to the difficulty of predicting the next word
- A lower perplexity is better for ASR



Spectral analysis: FFT, LPC, PLP, MFCC, filter-banks

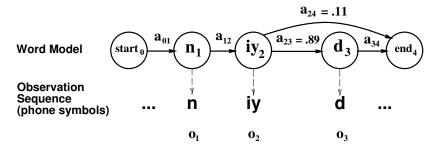


- Need a spectral representation
- FFT: too noisy
- LPC: wrong sensitivity
- Resolution of the ear (Mel Freq, PLP, Filter banks)
- Sound level in dB (PLP, Filter banks)
- Spectral shape (MFCC)





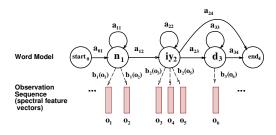
Hidden Markov Models: Markov chains



Word models: simple phone state model for need

- Each transition has a probability
- start and end are special states
- Each state or each transition has associated sound observations with a distinct probability density function (PDF)

Hidden Markov Models: Observation probabilities

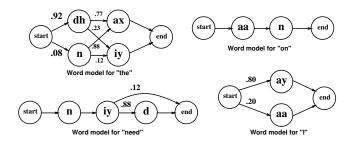


Observed are sound "spectra" for time "frames"

- Observation sequences have a probability
- Calculate this probability for each possible word
- \bullet Probabilities of O_i calculated from all possible underlying states
- Chose word sequence with the highest overall probability



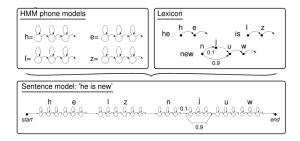
Hidden Markov Models: Pronunciation networks



Construct phone state models for each word in the dictionary

- The possible pronunciations for each word have to be encoded in the dictionary
- The transition probabilities are "trained" from the frequency of occurrence of the pronunciation in the speech corpus

Hidden Markov Models: Phone networks



Phone models are concatenated into utterance networks

- Each word model is itself a Markov finite state network of phone models
- Phones and word are connected through the start and end states (not shown)

Hidden Markov Models: Context Sensitive Phone latices

Phone models are constructed of subphone states in context

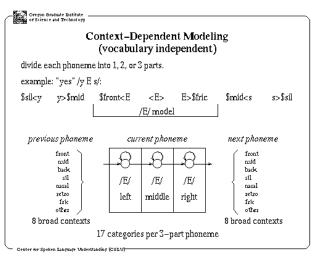
- Each phone model is itself a Markov finite state network
- For each phoneme context separate phone models are constructed
- Each sub-phone context sensitive state can have it's own observation PDF
- For the sake of reducing training, the observation PDF's of different states are tied (i.e. made identical)





Hidden Markov Models: Context Sensitive Phone latices

[CSLU()]







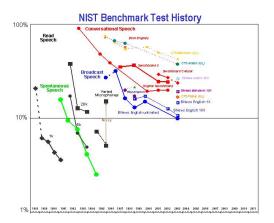
Evaluation: NIST, DARPA, hubs and spokes

The National Institute of Standards (NIST) and the DARPA program organize evaluation "contests" for ASR systems

- Tests contain mandatory core components hubs
- Tests contain optional specialized components spokes
- Tests evolve to include not only Speech-to-Text but also who spoke when, speaker localization etc.
- Includes varying speech material and conditions
- Contestants get training materials from the organization
- After time for training, contestants receive test speech and have to return the results



Evaluation: NIST results [Pallett(2003)]



- WER (vertical) go down over time
- More complex tasks introduced over time

Assignment: Week 7 Tone recognition

Recognize level and rising tones

- New → Create PitchTier... level 0 0.6
- Modify → Add point... 0.05 200 & Add point... 0.55 200
- New → Create PitchTier... rising 0 0.6
- Modify → Add point... 0.05 100 & Add point... 0.55 200
- Add silences to both PitchTiers: Add point... 0.049 0 & Add point... 0.551 0
- Select PitchTier < level | rising > → To Pitch... 0.02 60 40
- Select Pitch <either one> Plav → Hum
- Record your voice imitating the pitch → Periodicity → To Pitch... < default settings>
- Select Pitch <either one> AND Pitch <vour voice> → To DTW... 24 10 yes yes no restriction
- Select DTW dtw_level_rising → Query → Get distance (weighted)
- Compare distances. How do you think you could improver recognition?
- See Blackboard for complete description.





Further Reading I

See chapter 7.1, 7.2, 7.5 [Jurafsky and Martin(2000)]



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Further Reading III



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Appendix A



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