

Speech Recognition

- **Speech recognition is the task of identifying a sequence of words uttered by a speaker, given the acoustic signal.**
- Speech recognition is difficult because the sounds made by a speaker are *ambiguous*.
- Example: "recognize Speech" sounds almost same as "wreck a nice beach"
- Several issues in speech recognition such as *segmentation, coarticulation, homophones(to, two, too)*

$$\operatorname{argmax}_{word_{1:t}} P(word_{1:t} | sound_{1:t}) = \operatorname{argmax}_{word_{1:t}} P(sound_{1:t} | word_{1:t}) P(word_{1:t}) .$$

- $P(sound_{1:t}|word_{1:t})$ is the *acoustic model*. $P(word_{1:t})$ is known as the *language model*.
- This approach was named the noise channel model by Claude Shannon(1948).

quickly. Even this short example shows several of the issues that make speech problematic.

2. First, **segmentation**: written words in English have spaces between them, but in fast speech there are no pauses in “wreck a nice” that would distinguish it as a multiword phrase as opposed to the single word “recognize.”
3. Second, **coarticulation**: when speaking quickly the “s” sound at the end of “nice” merges with the “b” sound at the beginning of “beach,” yielding something that is close to a “sp.” Another problem that does not show up in this example is **homophones**—words like “to,” “too,” and “two” that sound the same but differ in meaning.

Acoustic Model

- Sound waves are periodic changes in pressure that propagate through the air.
- Approximates the amplitude of the sound wave—at discrete intervals called the *sampling rate*.
- The precision of each measurement is determined by the *quantization factor* sampling at 8 kHz with 8-bit quantization.
- A *phone* is the sound that corresponds to a single vowel or consonant, but there are some complications:
- combinations of letters, such as “th” and “ng” produce single phones, and
- Some letters produce different phones in different contexts (e.g., the “a” in rat and rate)

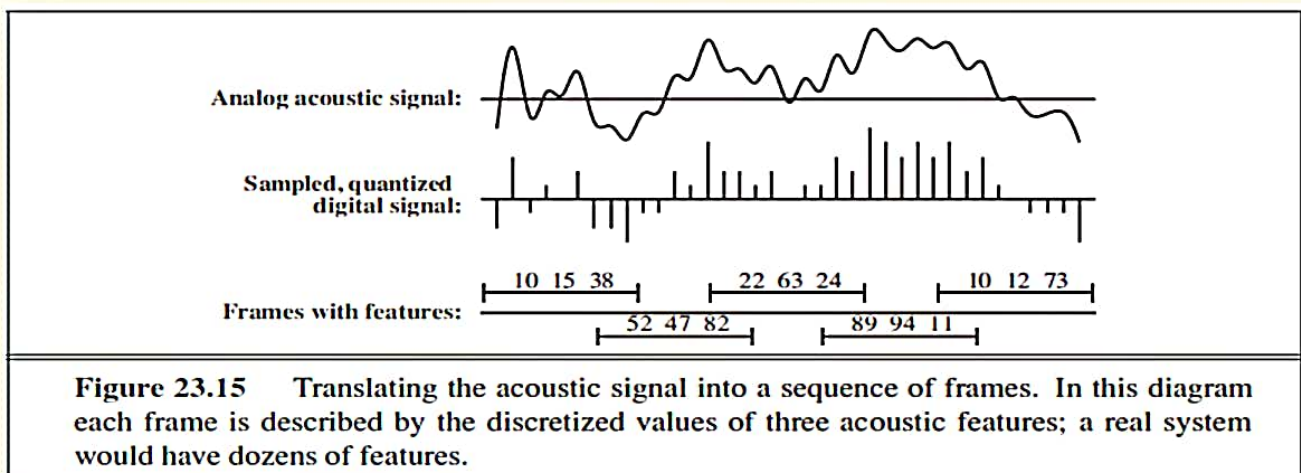
Acoustic Model

Vowels		Consonants B–N		Consonants P–Z	
Phone	Example	Phone	Example	Phone	Example
[iy]	b <u>ea</u> t	[b]	<u>b</u> et	[p]	<u>p</u> et
[ih]	b <u>i</u> t	[ch]	<u>Ch</u> et	[r]	<u>r</u> at
[eh]	b <u>e</u> t	[d]	<u>d</u> ebt	[s]	<u>s</u> et
[æ]	b <u>a</u> t	[f]	<u>f</u> at	[sh]	<u>sh</u> oe
[ah]	b <u>u</u> t	[g]	<u>g</u> et	[t]	<u>t</u> en
[ao]	b <u>ough</u> t	[hh]	<u>h</u> at	[th]	<u>th</u> ick
[ow]	b <u>oa</u> t	[hv]	<u>h</u> igh	[dh]	<u>th</u> at
[uh]	b <u>oo</u> k	[jh]	<u>j</u> et	[dx]	<u>b</u> utter
[ey]	b <u>ai</u> t	[k]	<u>k</u> ick	[v]	<u>v</u> et
[er]	B <u>e</u> rt	[l]	<u>l</u> et	[w]	<u>w</u> et
[ay]	b <u>uy</u>	[el]	bott <u>le</u>	[wh]	<u>wh</u> ich
[oy]	b <u>oy</u>	[m]	<u>m</u> et	[y]	<u>y</u> et
[axr]	din <u>er</u>	[em]	bottom <u>m</u>	[z]	<u>z</u> oo
[aw]	d <u>ow</u> n	[n]	<u>n</u> et	[zh]	meas <u>ure</u>
[ax]	<u>a</u> bout	[en]	butt <u>on</u>		
[ix]	ros <u>e</u> s	[ng]	s <u>ing</u>		
[aa]	c <u>o</u> t	[eng]	wash <u>ing</u>	[-]	<i>silence</i>

Figure 23.14 The ARPA phonetic alphabet, or **ARPAbet**, listing all the phones used in American English. There are several alternative notations, including an International Phonetic Alphabet (IPA), which contains the phones in all known languages.

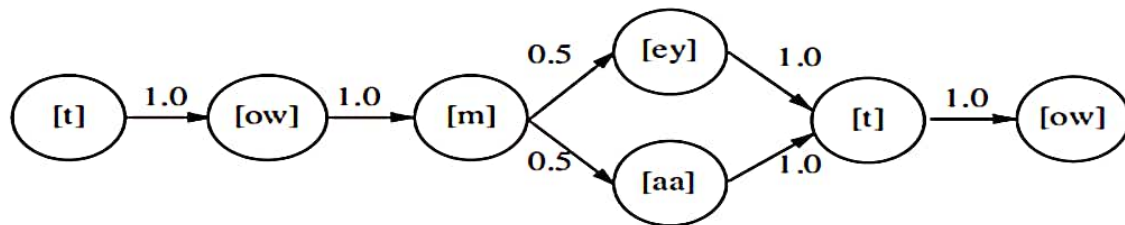
Acoustic Model

- A phoneme is the smallest unit of sound that has a distinct meaning to speakers of a particular language. For example, the “t” in “stick” sounds similar enough to the “t” in “tick” that speakers of English consider them the same phoneme.
- Speech systems summarize the properties of the signal over time slices called *frames*. Each frame is summarized by a vector of *features*.
- First *Fourier transform* is used to determine the amount of acoustic energy at about a dozen frequencies. Then compute a measure called the *mel frequency ceptral coefficient(MFCC)* for each frequency.



Acoustic Model

(a) Word model with dialect variation:



(b) Word model with coarticulation and dialect variations

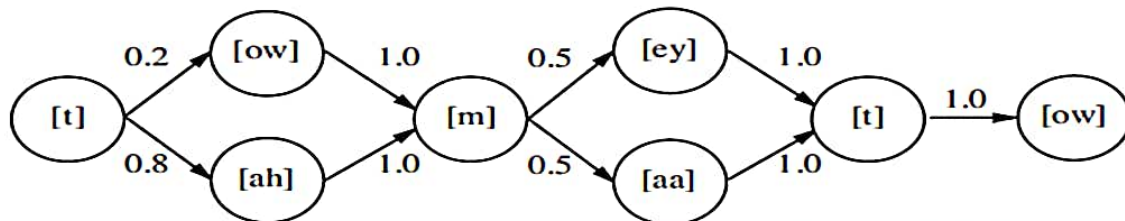


Figure 23.17 Two pronunciation models of the word “tomato.” Each model is shown as a transition diagram with states as circles and arrows showing allowed transitions with their associated probabilities. (a) A model allowing for dialect differences. The 0.5 numbers are estimates based on the two authors’ preferred pronunciations. (b) A model with a coarticulation effect on the first vowel, allowing either the [ow] or the [ah] phone.

Language Model

- Spoken language has different characteristics than written language, so it is better to get a corpus of transcripts of spoken language.
- For task-specific speech recognition, the corpus should be task-specific.
- To build your airline reservation system, get transcripts of prior calls.
- For example, asking “What city do you want to go to?” elicits a response with a highly constrained language model, while asking “How can I help you?” does not