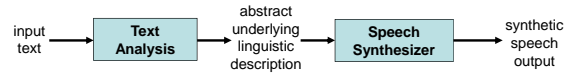


Digital Speech Processing— Lecture 18

Text-to-Speech (TTS) Synthesis Systems

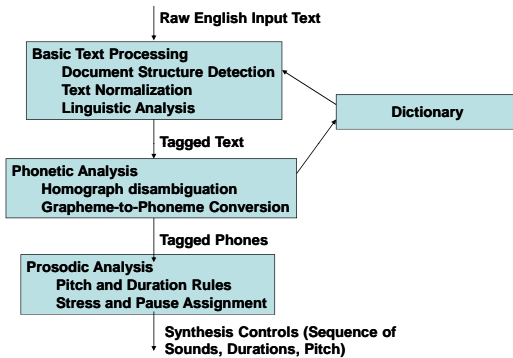
Text-to-Speech (TTS) Synthesis

- **GOAL:** convert arbitrary textual messages to *intelligible* and *natural* sounding synthetic speech so as to transmit information from a machine to a person



- pronunciation of text => phonemes, stress, intonation, duration
- syntactic structure of sentence (pauses, rate of speaking, emphasis)
- semantic focus, ambiguity resolution (duration, intonation)
 - rules for word etymology (especially names, foreign terms)

Text Analysis Components



Document Structure

- **end of sentence** marked by ‘.?!’ is not infallible
 - “The car is 72.5 in. long”
- **e-mail** and web pages need special processing
 - Larry:
 - Sure. I'll try to do it before Thursday :-)
 - Ed
- **multiple languages**
 - insertion of foreign words, unusual accent and diacritical marks, etc.

Text Normalization

- **abbreviations and acronyms**
 - Dr. is pronounced either as Doctor or drive depending on context (Dr. Smith lives on Smith Dr.)
 - St. is pronounced either as ‘street’ or ‘Saint’ depending on context (I live on Bourbon St. in St. Louis)
 - DC is either direct current or District of Columbia
 - MIT is pronounced as either ‘M I T’ or ‘Massachusetts Institute of Technology’ but never as ‘mitt’
 - DEC is pronounced as either ‘deck’ or ‘Digital Equipment Company’ but never as ‘D E C’
- **numbers**
 - 370-1111 can be either ‘three seven oh ...’ or ‘three seventy-model 1111’ for the IBM 370 computer
 - 1920 is either ‘nineteen-twenty’ or ‘one thousand, nine hundred, twenty’
- **dates, times currency, account numbers, ordinals, cardinals, math**
 - Feb. 15, 1983 needs to convert to ‘February fifteenth, nineteen eighty-three’
 - \$10.50 is pronounced as ‘ten dollars and fifty cents’
 - part # 10-50 needs to be pronounced as ‘part number 10 dash fifty’ rather than ‘part pound sign ten to fifty’

Text Normalization

- **proper names**
 - Rudy Prpch is pronounced as ‘Rudy Perpich’
 - Sorin Ducan is pronounced as ‘Sorin Duchan’
- **part of speech**
 - read is pronounced as ‘reed’ or ‘red’
 - record is pronounced as ‘rec-ard’ or ‘ri-cord’
- **word decomposition**
 - need to decompose complex words into base forms (morphemes) to determine pronunciation (‘indivisibility’ needs to be decomposed into ‘in-di-visible-ity’ to determine pronunciation)

Text Normalization

- proper handling of **special symbols** in text
 - punctuation, e.g., . , ; ' " - -- _ * & () ^ % @ ! ~ < > ? / \ = +
- string resolution**
 - 10:20 can be pronounced as either 'twenty after 10 (as a time)' or 'ten to twenty' (as a sequence)

Knowledge Source Confusions

- Let us pray ----- Lettuce spray
- Pay per view ----- Paper view
- Meet her on Main St. ----- Meter on Main St.
- It is easy to recognize speech ----- It is easy to wreck a nice beach

8

Linguistic Analysis

- part-of-speech (POS)
- word sense
- phrases
- anaphora
- emphasis
- style

a conventional parser could be used, but typically a simple shallow analysis is done for speed (parsers are not real-time!)

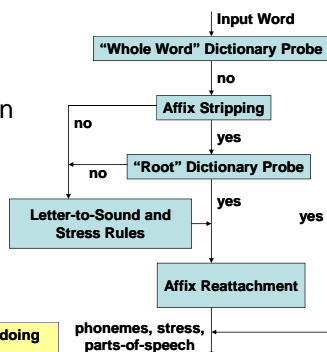
Homograph Disambiguation

- "an absent boy" versus "do you choose to absent yourself?"
- "they will abuse him" versus "they won't take abuse"
- "an overnight bag" versus "are you staying overnight?"
- "he is a learned man" versus "he learned to play piano"
- "El Camino Real road" versus "real world"

Letter-to-Sound (LTS) Conversion

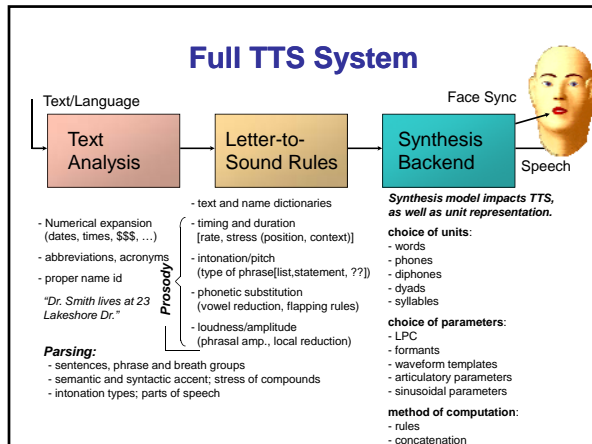
- CART (Classification and Regression Tree) analysis
- conventional dictionary search with letter-to-sound rules

This is only ONE way of doing LTS. FSMs are another.



Prosody

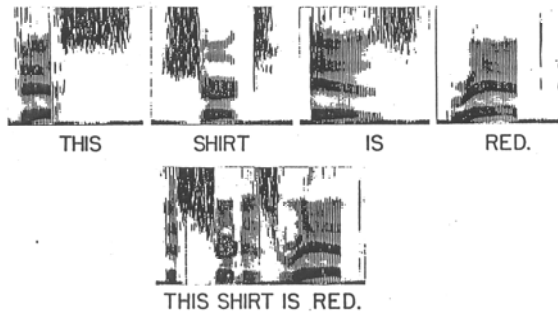
- pauses**
 - to indicate phrases and to avoid running out of breath
- pitch**
 - fundamental frequency (F0) as a function of time
- rate/relative duration**
 - phoneme durations, timing, and rhythm
- loudness**
 - relative amplitude/volume



Word Concatenation Synthesis

- words in sentences are much shorter than in isolation (up to 50% shorter) (see next page)
- words cannot preserve sentence-level stress, rhythm or intonation patterns
- too many words to store (1.7 million surnames), extended words using prefixes and suffixes

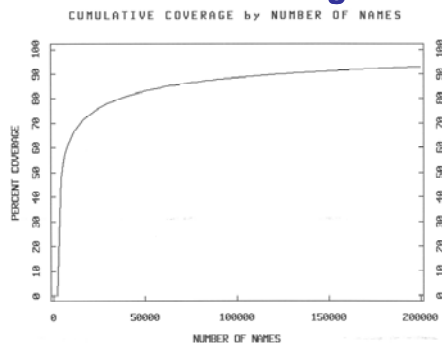
Word Concatenation



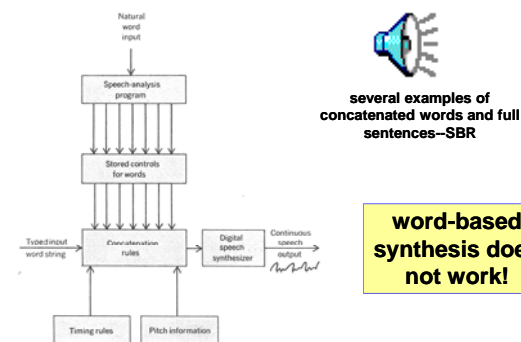
Proper Name Statistics

Number of Names	Coverage
10	4.9%
100	16.3%
5,000	59.1%
50,000	83.2%
100,000	88.6%
200,000	93.0%

Statistics of Proper Name Coverage

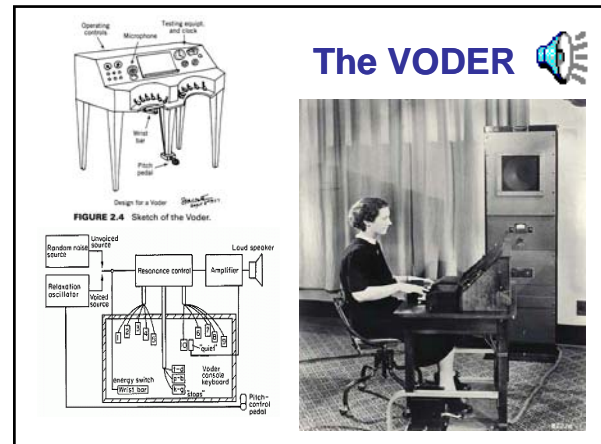


Concatenative Word Synthesis



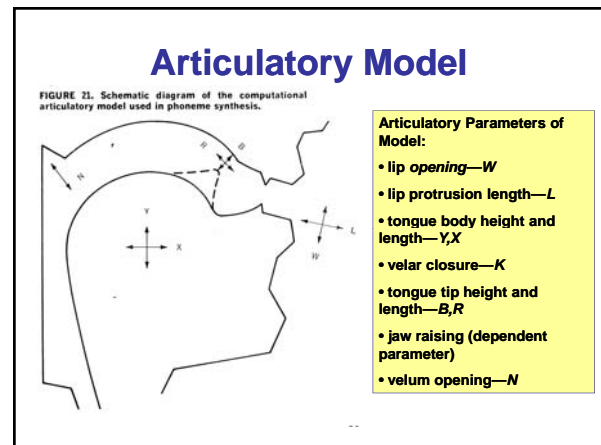
Speech Synthesis Methods

- 1939—the VODER (Voice Operated Demonstrator)—Homer Dudley
 - based on a simple model of speech sound production
 - select voicing source (with foot pedal control of pitch) or noise source
 - ten filters shaped the source to produce vocal or noise-excited sounds—controlled by finger motions
 - separate keys for stop sounds
 - wrist bar control of signal energy



Articulatory Synthesis

- *in theory* — can create more natural and more realistic motions of the articulators (rather than formant parameters), thereby leading to more natural sounding synthetic speech
 - utilize physical constraints of articulator movements
 - use X-ray data to characterize individual speech sounds
 - model how articulatory parameters move smoothly between sounds
 - *direct method*: solve wave equation for sound pressure at lips
 - *indirect method*: convert to formants or LPC parameters for final synthesis in order to utilize existing synthesizers
 - use highly constrained motions of articulatory parameters



Articulatory Synthesis Using Formant Synthesizer Backend

[Cecil Coker—teaching computers to talk](#)

Articulatory Synthesis of Speech—Cecil Coker

Articulatory Synthesis by Copying Measured Vocal Tract Data

- fully automatic closed-loop optimization
 - initialized from articulatory codebooks, neural nets
 - Schroeter and Sondhi, 1987

One example: original:



re-synthesis:

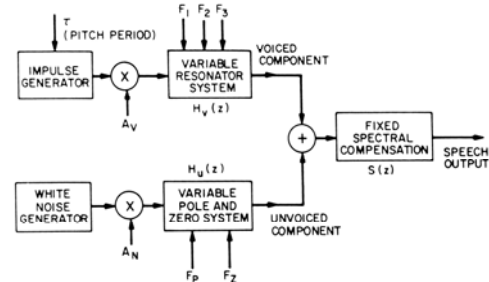


Articulatory Synthesis Issues

- requires highly accurate models of glottis and vocal tract
- requires rules for dynamics of the articulators

Source-Filter Synthesis Models

- cascade/serial (formant) synthesis model



Serial/Formant Synthesis Model

- **flaws in the serial/formant synthesis model:**
 - can't handle voiced fricatives
 - no zeros for nasal sounds
 - no precise control for stop consonants
 - pitch pulse shape fixed—-independent of pitch
 - spectral compensation is inadequate



OVE 1-Fant



SPASS synthesis



JSRU Synthesis



"To Be ..."-Bell Labs



We Wish You ...



Daisy-Daisy with music

Parallel Synthesis Model

A serial synthesizer is a good approach for open, non-nasal vocal tracts (vowels, liquids). For obstruents and nasals, we need to control the amplitudes of each resonance, and to introduce zeros in addition to the poles.

$$V(z) = \prod_{k=1}^4 \frac{1 - 2r_k \cos(\theta_k) + r_k^2}{1 - 2r_k \cos(\theta_k)z^{-1} + r_k^2 z^{-2}}$$

$$= \sum_{k=1}^4 \frac{A_k - B_k z^{-1}}{1 - 2r_k \cos(\theta_k)z^{-1} + r_k^2 z^{-2}}$$

- use the approximation

$$V(z) \approx \sum_{k=1}^4 \frac{A_k}{1 - 2r_k \cos(\theta_k)z^{-1} + r_k^2 z^{-2}}$$

parallel synthesizer provides more flexibility in matching spectrum levels at formant frequencies (via gain controls)—however, zeros are introduced into the spectrum.

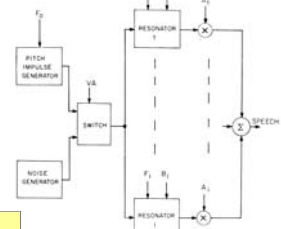


FIG. 7. Parallel terminal-analog synthesizer.

Parallel Synthesis

- **issues:**
 - need individual resonance amplitudes (A_1, \dots, A_4)—if resonances are close, this is a messy calculation
 - phasing of resonances neglected (the $B_k z^{-1}$ terms)
 - synthetic speech has both resonances and zeros (at frequencies between the resonances) that may be perceptible
 - better reproduction of complex consonants



Parallel synthesis-Holmes

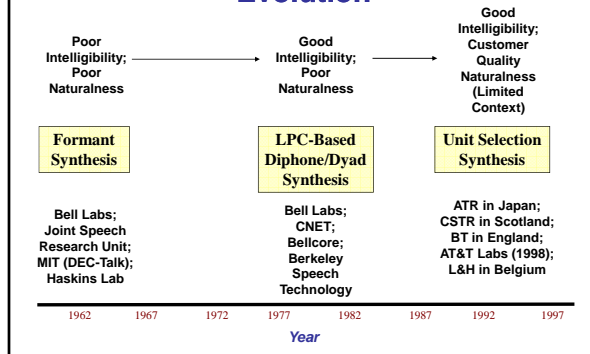


Parallel synthesis from BYU

Continuing Evolution (1959-1987)

- Haskins, 1959
- KTH – Stockholm, 1962
- Bell Labs, 1973
- MIT, 1976
- MIT-talk, 1979
- Speak 'N spell, 1980
- BELL Labs, 1985
- Dec talk, 1987

Text-to-Speech Synthesis (TTS) Evolution



Speech Synthesis—the 90's

- what changed?
 - TTS was highly intelligible but extremely unnatural sounding
 - a decade of work had not changed the naturalness substantially
 - computation and memory grew with Moore's law, enabling highly complex concatenative systems to be created, implemented and perfected
 - concatenative systems showed themselves capable of producing (in some cases) extremely natural sounding synthetic speech

Concatenation TTS Systems

- key idea: use segments of recorded speech for synthesis
- data driven approach → more segments give better synthesis → using an infinite number of segments leads to perfect synthesis
- key issues:
 - what units to use
 - how to select units from natural speech
 - how to label and extract consistent units from a large database
 - what signal representation should be used for spectrally smoothing units (at junctures) and for prosody modification (pitch, duration, amplitude)

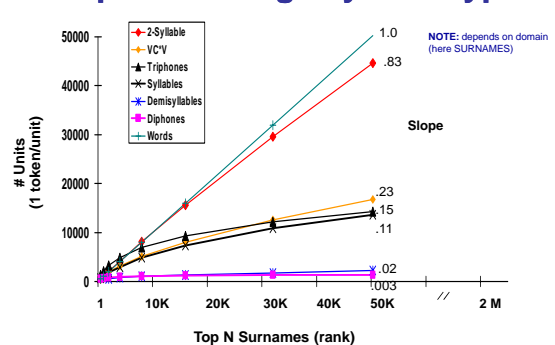
Concatenation Units

- choice of units:
 - Words**—there are an infinite number of them
 - Syllables**—there are about 10K in English
 - Phonemes**—there are about 45 in English
 - Demi-syllables**—there are about 2500 in English
 - Diphones**—there are about 1500-2500 in English

Choice of Units

Length	Unit	# Units (English)	# Rules, Necessary Unit Modifications	Quality
Short	Allophone	60-80	Many	Low
	Diphone	$< 40^2 - 65^2$		
	Triphone	$< 40^3 - 65^3$		
	Demisyllable	2K		
	Syllable	11K		
	VC*V			
	2-syllable	$< 11 K^2$		
	Word	100K-1.5M		
	Phrase	∞	Few	High
Long	Sentence			

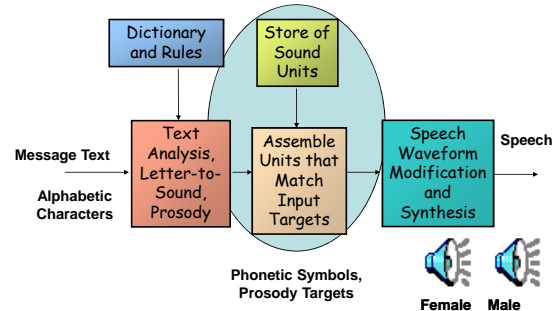
Corpus Coverage by Unit Type



Concatenation Units

- **Words:**
 - no complete coverage for broad domains → words have to be supplemented with smaller units
 - limited ability to modify pitch, amplitude and duration without losing naturalness and intelligibility
 - need huge database to extract multiple versions of each word
- **Sub-Words:**
 - hard to isolate in context due to co-articulation
 - need allophonic variations to characterize units in all contexts
 - puts large burden on signal processing to smooth at unit join points

Block Diagram of a Concatenative TTS System



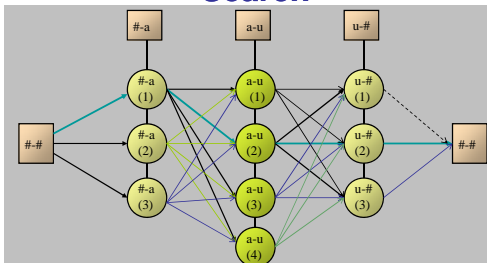
Procedure for Concatenative Synthesis

- off-line inventory preparation:
 - record speech corpus and process with coding method of choice
 - determine location of speech units and store units in inventory
- on-line synthesis from text
 - normalize input text (expand abbreviations, etc.)
 - letter-to-sound (pronunciation dictionary and rules)
 - prosody (melody/pitch& durations, stress patterns/amplitudes, ...)
 - select appropriate sequence of units from inventory
 - modify units (smooth at boundaries, match desired prosody)
 - synthesize and output speech signal

Unit Selection Synthesis

- need to optimally match units at boundaries, e.g., fundamental frequency (pitch), and spectrum
- need to automatically and efficiently select optimal sequence of units from database
- issues in Unit Selection Synthesis
 - several examples in each unit category (from 10 to 10⁶)
 - waveform modification used sparingly (leads to perceived distortions)
 - high intelligibility must be maintained
 - "customer quality" attained with reasonable training set (1-10 hours)
 - "natural quality" attained with large training set (10's of hours)
 - "unit selection" algorithm must run in a fraction of real time on a state-of-the-art processor

(On-line) Unit Selection: Viterbi Search













- transitional (**concatenation**) costs are based on acoustic distances
- node (**target**) costs are based on linguistic identity of unit

Unit Selection Measures

- USD—Unit Segmental Distortion → differences between desired spectral pattern of target and that of candidate unit, throughout whole unit
- UCD—Unit Concatenative Distortion → spectral discontinuity across boundaries of the concatenated units

Example: source context—want—/w ah n t/
 target context—cart—/k ah r t/
 USD → (ah → n versus ah → r)

Modern TTS Systems (Natural Voices from AT&T)

- Soliloquy from Hamlet—  NV2005
- Gettysburg Address—  NV2005
- Bob Story—
- German female—
- UK British female—
- Spanish female—
- Korean female—
- French male—

Modern COMMERCIAL Systems

- Lucent 
- AcuVoice 
- Festival 
- L&H RealSpeak 
- SpeechWorks female 
- SpeechWorks male 
- Csel (Actor) - Italian 

TTS Future Needs

- TTS needs to know **how** things should be said
- context-sensitive pronunciations of words
- prosody prediction → emphasis
 - *I gave the book to John (not someone else)*
 - *I gave the book to John (not the photos)*
 - *I gave the book to John (I did it, not someone else)*
- unit selection process → target cost captures mismatch between predicted unit specification (phoneme name, duration, pitch, spectral properties) and actual features of a candidate recorded unit → need better spectral distance measures that incorporate human perception
- better signal processing → compress units for small footprint devices

Business Drivers of TTS

- **cost reduction**
 - TTS as a dialog component for customer care
 - TTS for delivering messages
 - TTS to replace expensive recorded IVR prompts
- **new products and services**
 - location-based services
 - providing information in cars (e.g., driving directions, traffic reports)
 - unified Messaging (reading e-mail, fax)
 - voice Portals (enterprise, home, phone access to Web-based services)
 - e-commerce (automatic information agents)
 - customized News, Stock Reports, Sports Scores
 - devices

Reading Email

Example: Old TTS, No Filter

From: Marilyn Walker <walker@research.att.com>
To: David Ross <davidross@home.com>
Subject: Re: Today's Meeting
Date: Tuesday, December 01, 1998 4:25 PM

4:30 is fine for me. See you at the meeting.

Marilyn

-----Original Message-----

From: David Ross <davidross@home.com>
To: Marilyn Walker <walker@research.att.com>
Date: Tuesday, December 01, 1998 2:25 PM
Subject: Today's Meeting

Today's meeting has been changed from 4:00 to 4:30 PM. If the time change is a problem, please send me email at davidross@home.com.

Thanks,

david ross

Reading Email (final)

Example: Enhanced TTS

From: Marilyn Walker <walker@research.att.com>
To: David Ross <davidross@home.com>
Subject: Re: Today's Meeting
Date: Tuesday, December 01, 1998 4:25 PM

4:30 is fine for me. See you at the meeting.

Marilyn Walker

-----Original Message-----

From: David Ross <davidross@home.com>
To: Marilyn Walker <walker@research.att.com>
Date: Tuesday, December 01, 1998 2:25 PM
Subject: Today's Meeting

Today's meeting has been changed from 4:00 to 4:30 PM. If the time change is a problem, please send me email at davidross@home.com.

Thanks,

david ross

TTS Application Categories

Devices	<ul style="list-style-type: none">PDAs, cellphones, gaming, talking appliances
Automotive Connectivity	<ul style="list-style-type: none">driving directions, city and restaurant guides, location services (e.g., "Macys has a sale!")
Consumer Communications	<ul style="list-style-type: none">voice control of cell phones, VCRs, TVshome information access over telephone ("Home Voice Portals")
Enterprise Communications	<ul style="list-style-type: none">information access over the phone such as sales information, HR, internal phonebook, messaging
Voice-assisted E-Commerce	<ul style="list-style-type: none">E-commerce, customer care (e.g., friendly automated talking web agents, FAQs, product information)
Call center Automation	<ul style="list-style-type: none">next-gen "HMIHY" automated operator services