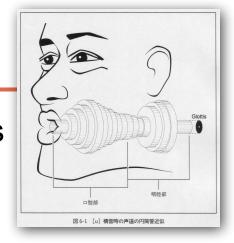
Nobuaki Minematsu

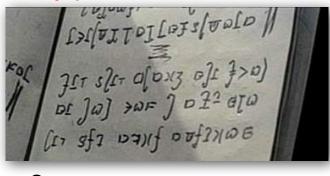


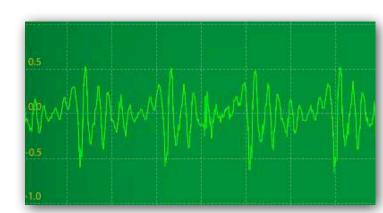


Today's menu

- Speech --> sounds --> vibrations (waves) of air particles
- Fundamentals of phonetics
 - How are vowel sounds produced?
 - Phonetics = articulatory phonetics + acoustic phon. + auditory phon.
- More on articulatory phonetics
 - Observation of speech organs
- More on general phonetics
 - General phonetics = language independent phonetics
 - How to symbolize language sounds found in any language?
- More on acoustic phonetics
 - Vowels as standing waves
 - Resonance frequency = formant frequency
 - Link between acoustic phon. and articulatory phon.
- Summary

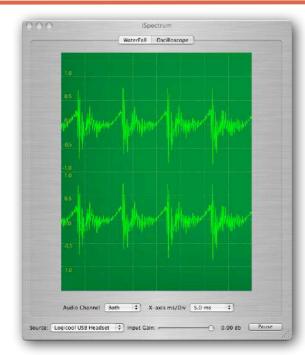






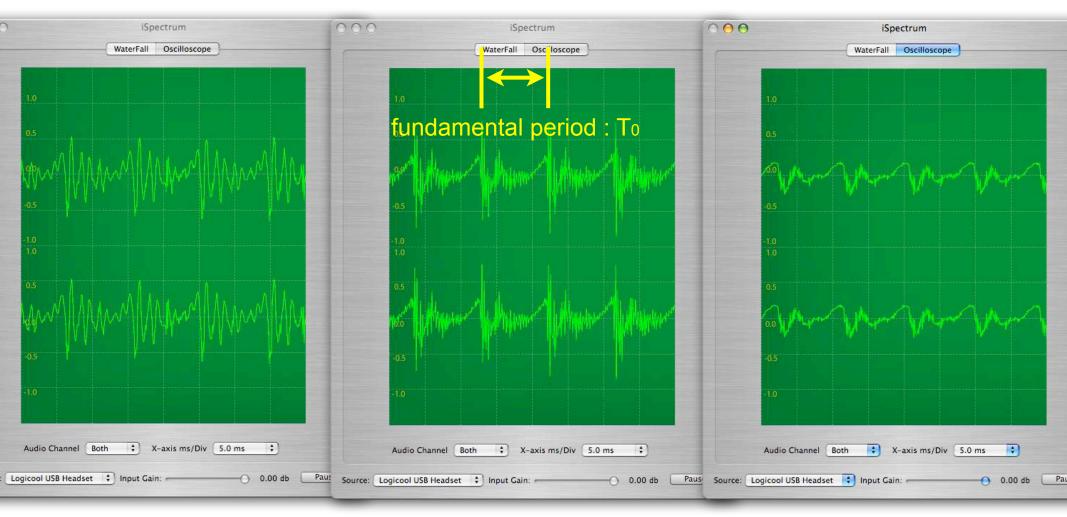
Speech = vibrations of air particles

- The four aspects of tones (sounds)
 - Height of tones (pitch of tones)
 - High tones and low tones
 - Loudness of tones
 - Loud tones and soft tones
 - Duration of tones
 - Long tones and short tones
 - Timbre of tones (color of tones, 音色, 声色)
 - ????
 - If two tones have the same height, the same loudness, and the same duration but the two tones are perceived as different tones, then, the two tones differ in their timbre.
 - /a/ and /i/ /a/ and /a/
 - difference in phoneme, difference in gender



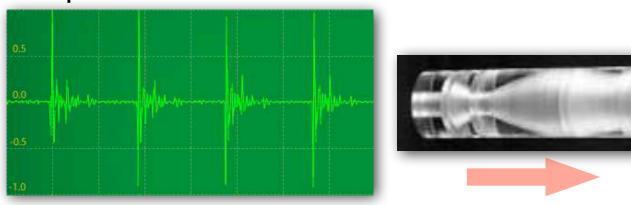
Speech = vibrations of air particles

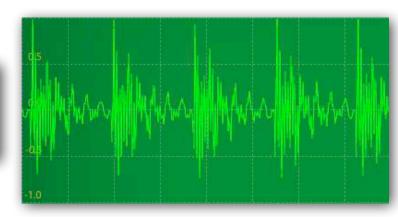
- Close observation of air particle vibration patterns.
 - /a/, /i/, and /u/ with the same height of tone.
 - They are periodic signals (waveforms).

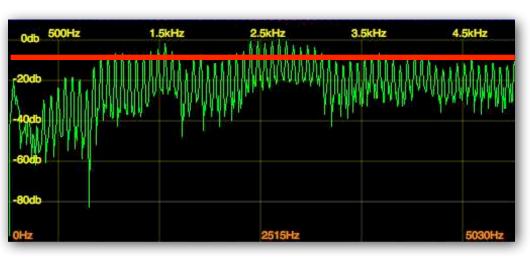


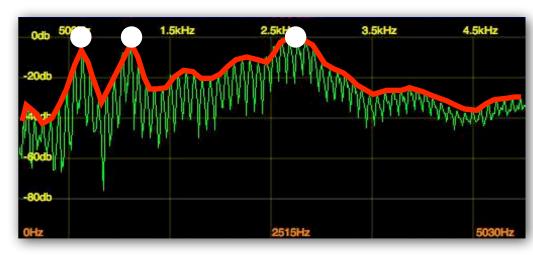
Acoustic phonetics

Spectrum of a vowel sound









Resonance = concentration of the energy on specific bands that are determined only by the shape of a tube used for sound generation.

Timbre = energy distribution pattern over the frequency axis

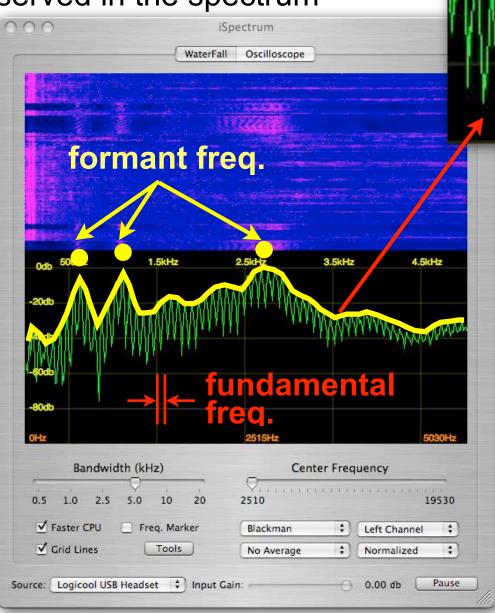
Fundamental frequency (Fo) and timbre

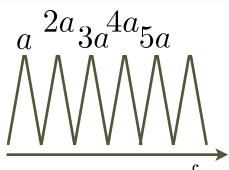
Fo and timbre observed in the spectrum

喉の形を変えると共振周波 数が変わる。つまり、エネ ルギー分布の様子(パワー スペクトル)が変わる。

これを、音響用語では音色 と呼ぶ。楽器の違いは音色 の違い、母音の違いも音色 の違いである。話者の違い もまた、音色の違いである







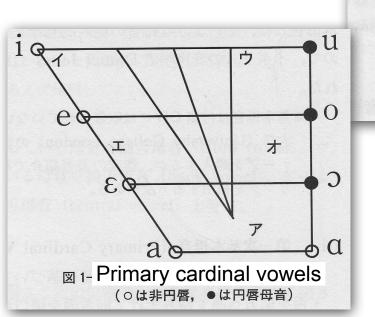
freq.

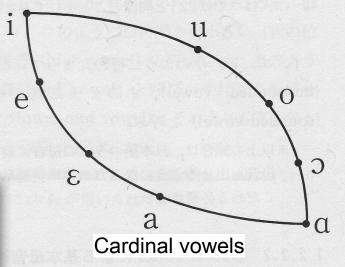
厳密には「音高=a」であって、ピークの間隔ではない。調波構造が無くても音高は感覚できる。



General phonetics

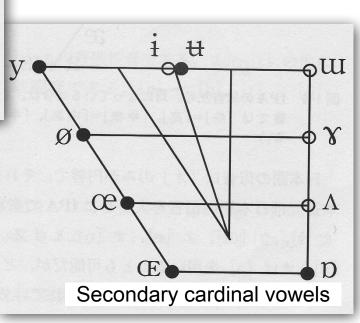
- 18 fundamental and theoretical vowels -- cardinal vowels
 - Reference vowels used to describe the vowel sounds in a specific language.
 - Theoretically and artificially defined vowels
 - Position of the tongue x lip (un)rounding gives a set of 18 vowels.





•: rounding

O: unrounding



manner of articulation

General phonetics

- Classification of consonants
 - Complete or partial closure in the vocal tract.
 - Where and how closure happens in the vocal tract.
 - Where = place of articulation
 - How = manner of articulation
 - Condition of the vocal folds = voiced or unvoiced

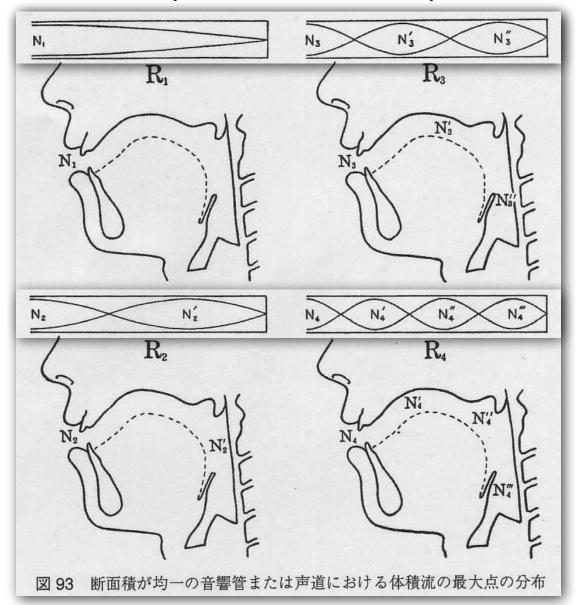
place of articulation

	Bila	bial	Labioo	tental	Den	tal	Alved	olar	Post-	alveolar	Reti	oflex	Pal	latal	Ve	elar	Uvi	ular	Phary	ngeal	Glo	ttal
Plosive	p	b					t	d			t	d	c	J	k	g	q	G			3	
Nasal		m		m			1	n				η		n		ŋ		N				
Trill		В					1	r								STEEL STEEL		R				
Tap or Flap							1	ſ			ŀ	t										
Fricative	ф	β	f	v	θ	ð	S Z	Z	ſ	3	Ş	Z,	ç	j	X	γ	χ	R	ħ	S	h	fi
Lateral fricative							4	ß														
Approximant				υ				I				-F		j		щ					fix	
Lateral approximant		56	TE SI	il is	79300		1	l				l		λ		L						

Where symbols appear in pairs, the one to the right represents a voiced consonant. Shaded areas denote articulations judged impossible.

Acoustic phonetics

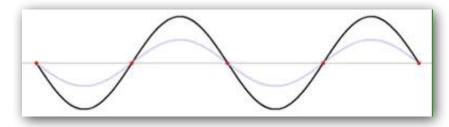
Vowel = a special kind of compression waves (longitudinal waves)



standing waves

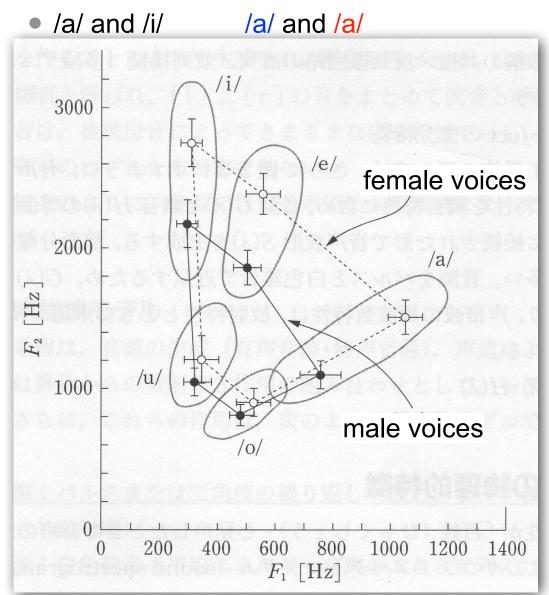
formant frequency

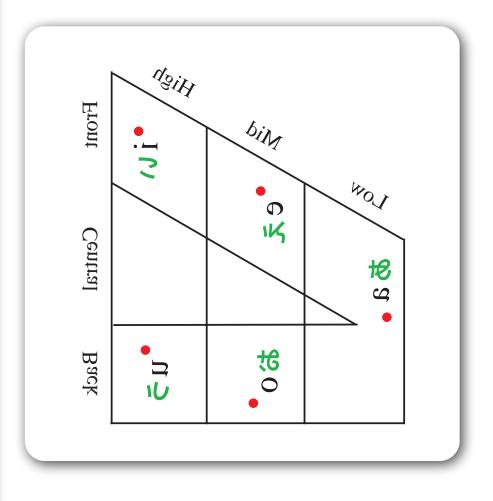
$$F_n = \frac{c}{4\underline{l}}(2\underline{n} + 1)$$



Acoustic and articulatory phonetics

Shape difference = resonance frequency difference





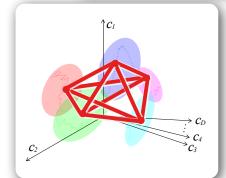
Title of each lecture

マルチメデア情報学の基礎

- Theme-1
 - Multimedia information and humans
 - Multimedia information and interaction between humans and machines
 - Multimedia information used in expressive and emotional processing
 - A wonder of sensation synesthesia -
- Theme-2
 - Speech communication technology articulatory & acoustic phonetics -
 - Speech communication technology speech analysis -
 - Speech communication technology speech recognition -
 - Speech communication technology speech synthesis -
- Theme-3
 - A new framework for "human-like" speech machines #1
 - A new framework for "human-like" speech machines #2
 - A new framework for "human-like" speech machines #3
 - A new framework for "human-like" speech machines #4



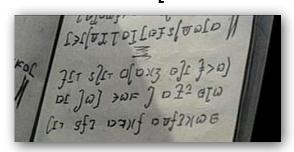




Phones and phonemes

Phones

- A phone is the minimal unit of speech of any language.
- Phonetic symbols are language-independent and used by phoneticians to transcribe speech of any language. Defined by by Int. Phonetic Association.
- Should be used like [a b c d e f g].



Dental	Alveolar	Retrofiex		
9	t d		t	d
	n			η

Phonemes

- A phoneme is the minimal unit of speech of a specific language, perceived by native speakers of that language.
- Phonemic symbols are language-dependent and used by ordinary people to transcribe speech of that language. Can be defined by a user.
- Should be used like / a b c d e f g /.

/arajurugeNzituo/ → [erejirigeendzitsio?]

Phones and phonemes

Sounds of a class can be perceived as sounds of different classes.

```
    とんぼ、とんねる、どんぐり [m], [n], [ŋ]
    ライト、ライト right, light
    すいか、たべますか? [sw], [s]
```

- For Japanese, they are of one class but for foreigners, they may be of different classes.
- Japanese may have less capacity of phone discrimination but they may have better capacity of discriminating sounds by their duration.
 - おばさん、おばあさん、 おかやま(岡山)、おおかやま(大加山)、おおおかやま(大岡山)
- Phonemes and allophones
 - One phoneme is sometimes acoustically realized as different phones.
 - $hldsymbol{h} \to [m], [n], [n], [n], and [n] are all ophones of <math>hldsymbol{h}$.
- Phones are objective(acoustic) and phonemes are subjective(mental)?
 - #phones >> #phonemes (30 -- 40). Phones are finer units of speech.
 - Definition of phones is still based on listeners' abstraction of speech acoustics.
 - The definition does not discriminate between adults' [a] and kids' [a] although their spectral envelopes are very different between them.

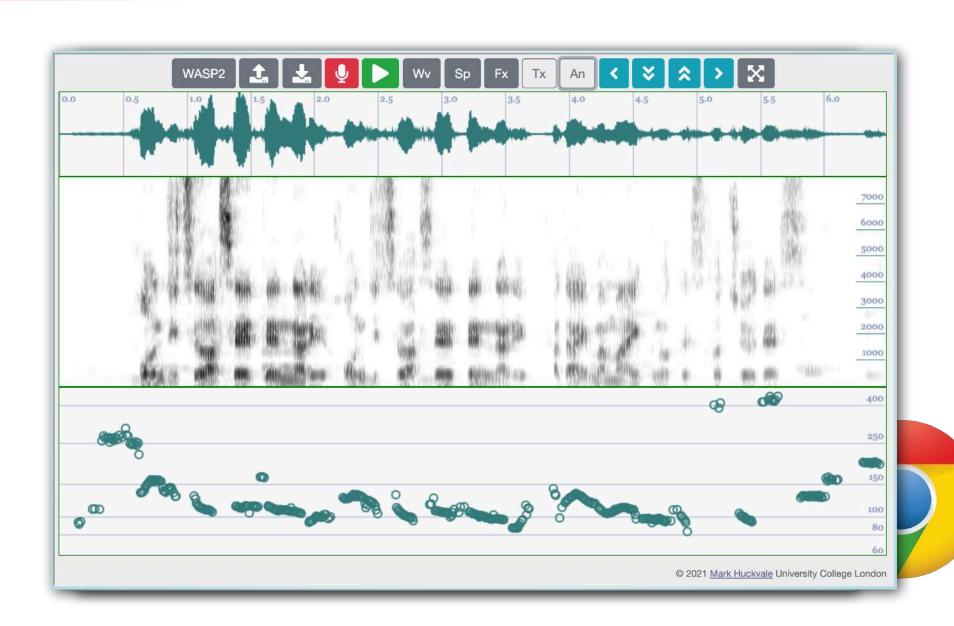
Speech Communication Tech. - Acoustic analysis of speech -

Nobuaki Minematsu





Web-based speech analyzer



Today's menu

- More on details of acoustic phonetics (continued)
 - Characteristics of human hearing
 - Fundamental frequency and pitch again
 - Fourier analysis of speech signals
 - Simple hearing tests
- Technology for acoustic analysis of speech
 - Source-filter model of speech production $S(\omega) = G(\omega)H(\omega)R(\omega)$
 - Cepstrum method to separate source and filter
 - Advanced analysis tool of STRAIGHT
 - Some morphing examples
 - LPC, PARCOR, and the shape of a vocal tube
- Spectrums/waveforms of various language sounds
 - Vowels, semivowels, liquids, nasals, voiced fricatives, unvoiced fricatives, glottals,
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 - Speech recognition as spectrum reading
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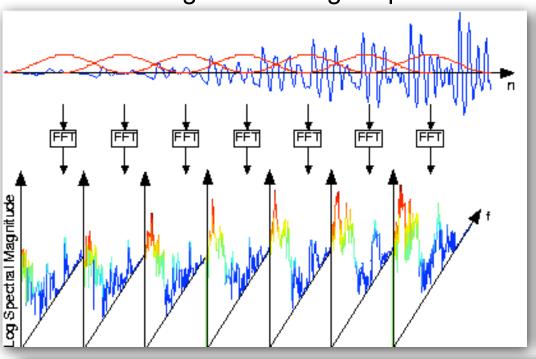


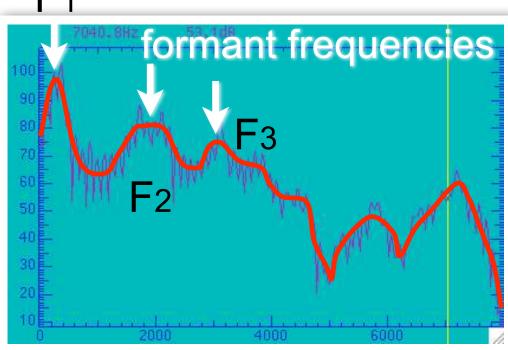


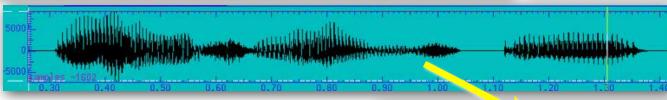
Acoustic phonetics

From waveforms to spectrums

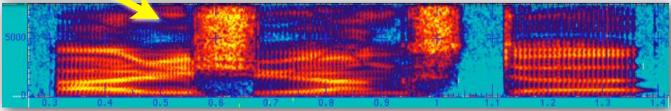
Windowing + FFT + log-amplitudeF1





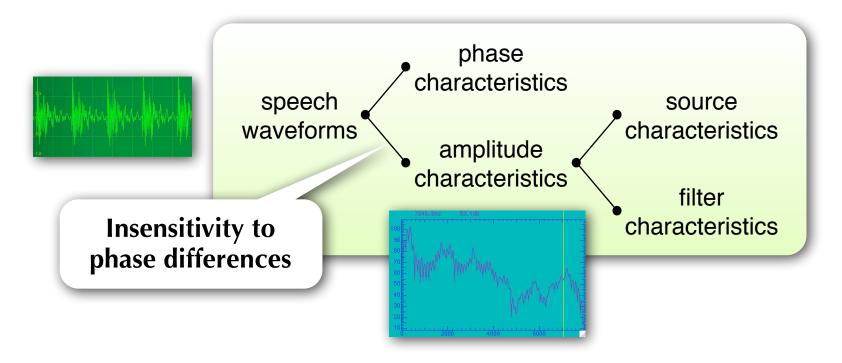


spectrogram



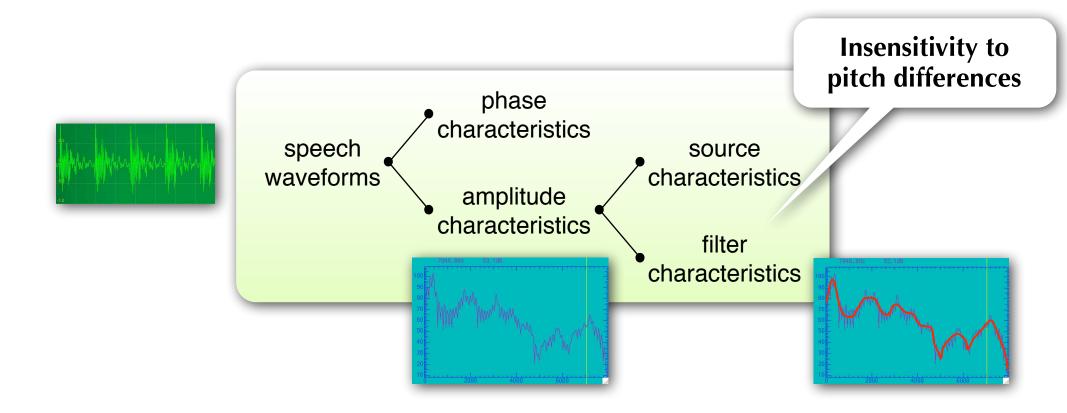
Waveform to spectrum

- From waveforms to spectrums
 - Windowing + FFT + log-amplitude
- Insensitivity of human ears to phase characteristics of speech
 - Human ears are basically "deaf" to phase differences in speech.
 - It is not impossible for us to discriminate two sounds acoustically with different phase characteristics but we don't discriminate them linguistically.
 - No language treats those two sounds as two different phonemes.

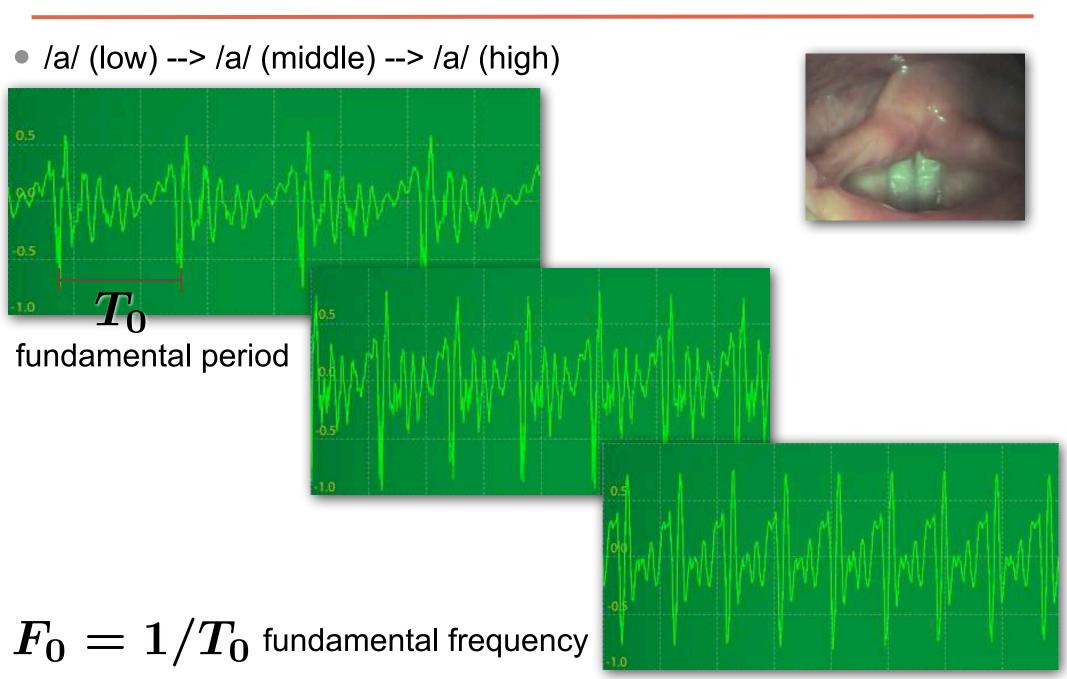


Spectrum to spectrum envelope

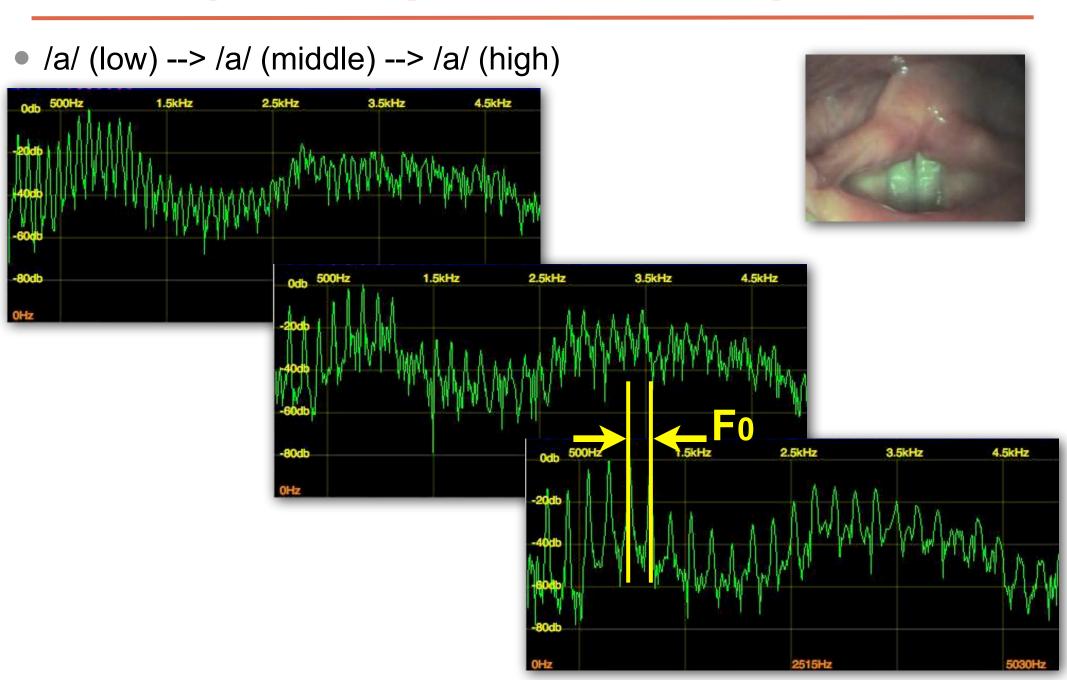
- From spectrums to spectrum envelopes
 - log-amplitude spectrum -> smoothing -> spectrum envelope
- Humans' insensitivity to pitch differences when perceiving phonemes.
 - /a/ with high tone and /a/ with low tone are perceived to be of the same class.
 - Separation of pitch (fundamental frequency) can be done by spectrum smoothing.



Speech waveforms and pitch



Speech spectrums and pitch



1 octave = doubled Fo

Mathematical mechanism of music (scale)

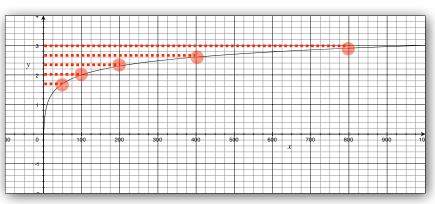


$$C \rightarrow C\# \rightarrow D \rightarrow D\# \rightarrow E \rightarrow F \rightarrow F\# \rightarrow G \rightarrow G\# \rightarrow A \rightarrow A\# \rightarrow B \rightarrow C$$

 $\times 2.0$

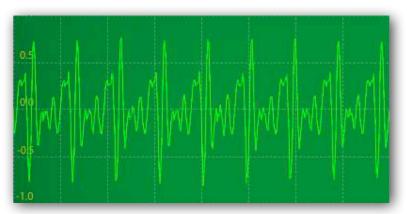
$$\times 1.059 \times 1.059 \times 1.059$$

$$1.059 = 2^{\frac{1}{12}}$$



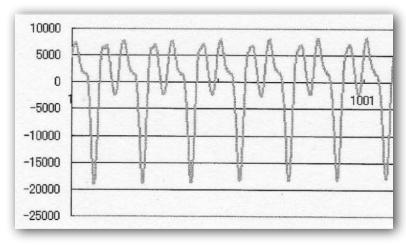
Harmonic structure

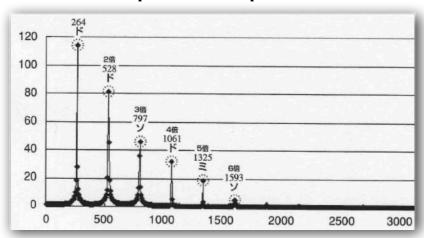
Speech waveforms and their log power spectrum





Guitar sound waveforms and their linear power spectrum

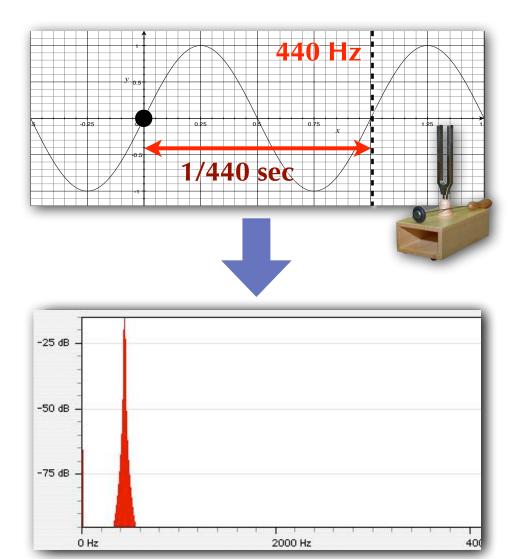


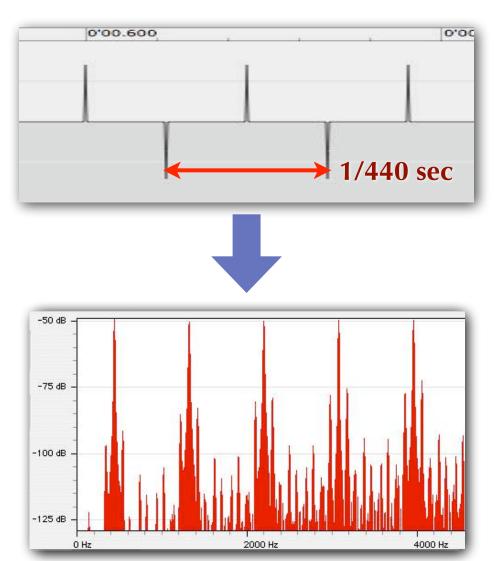


- Fundamental tone + 2nd harmonic + 3rd harmonic +
 - Fourier series of periodic signals -> Results (spectrums) also become periodic.

Harmonic structure

- Pure tone and complex tone
 - Waveforms and their linear/log power spectrum

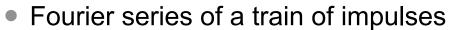




Fourier series and speech production

- Periodic signals are decomposed into \sum sinusoidal waveforms
 - Periodic signals have a set of line spectrums.
- Fourier series of a train of impulses
 - A train of impulses

$$g(t) = \sum_{k=-\infty}^{\infty} \delta(t - kT_0)$$



$$g(t) = \sum_{n = -\infty}^{\infty} \alpha_n e^{jn\omega_0 t}$$

$$\alpha_n = \frac{1}{T_0} \int_{-\frac{T_0}{2}}^{\frac{T_0}{2}} g(t) e^{-jn\omega_0 t} dt = \frac{1}{T_0} \int_{-\frac{T_0}{2}}^{\frac{T_0}{2}} \delta(t) e^{-jn\omega_0 t} dt = \frac{1}{T_0}$$



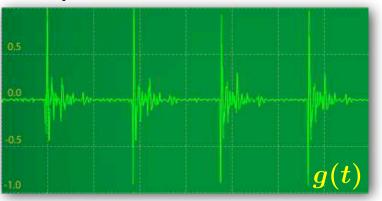
Fourier transform of a train of impulses

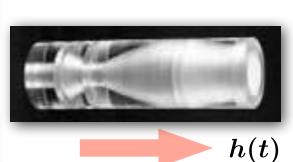
$$G(\omega) = \frac{1}{T_0} \sum_{n=-\infty}^{\infty} \int_{-\infty}^{\infty} \left\{ 1 \times e^{jn\omega_0 t} \right\} e^{-j\omega t} dt = \frac{2\pi}{T_0} \sum_{n=-\infty}^{\infty} \delta(\omega - n\omega_0)$$

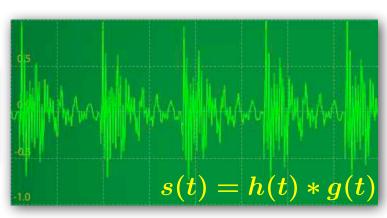
- Vowel production as convolution of impulse response
 - Vocal tract (tube) functions as a filter : impulse response of h(t)
 - Glottal source waveform : g(t), output waveform : s(t)

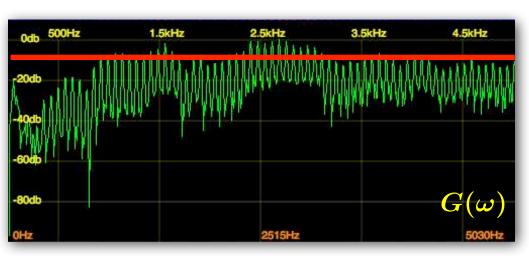
Acoustic phonetics

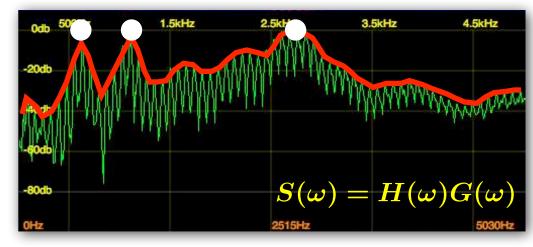
Spectrum of a vowel sound







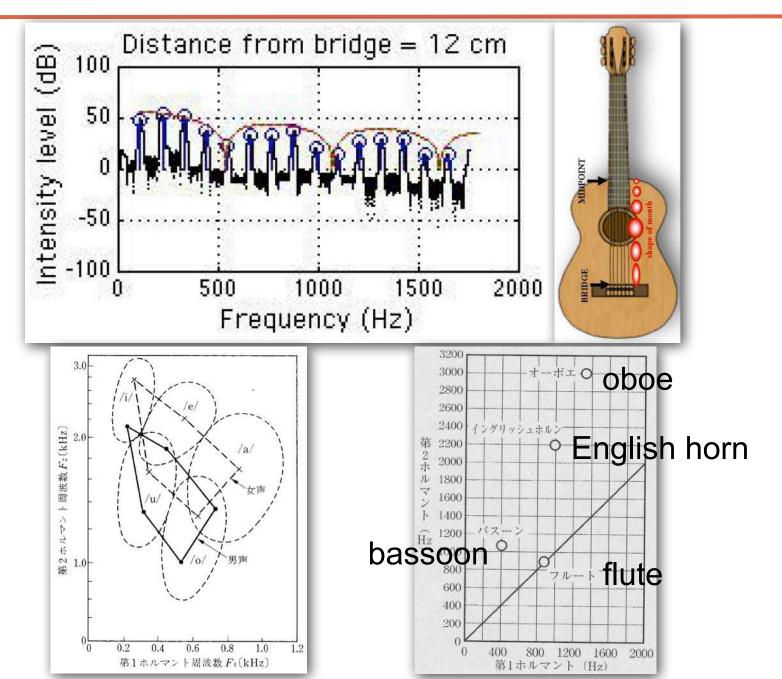




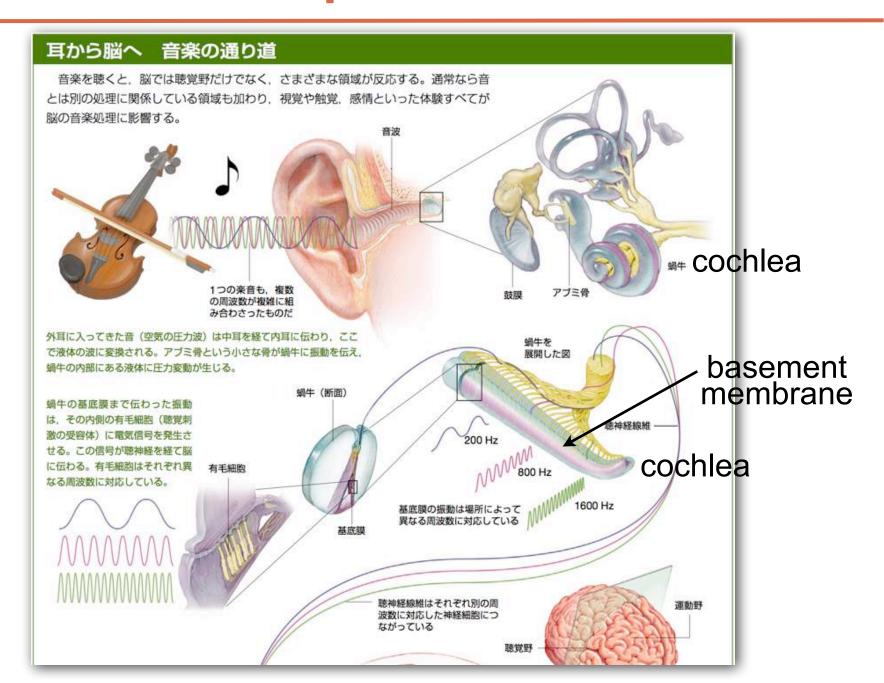
Resonance = concentration of the energy on specific bands that are determined only by the shape of a tube used for sound generation.

Timbre = energy distribution pattern over the frequency axis

Spectrum analysis of guitar sounds

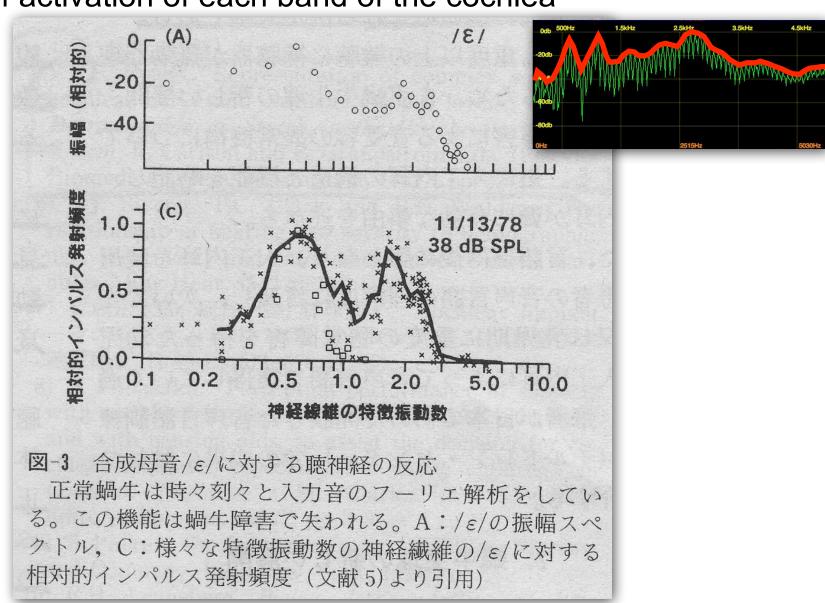


How sounds are processed in the ears



Ear = Fourier analyzer

Frequency of activation of each band of the cochlea

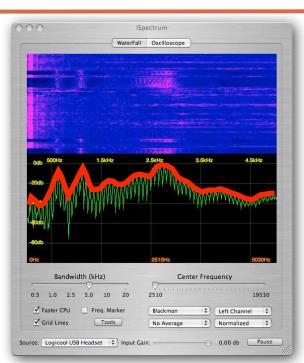


Speech = vibrations of air particles

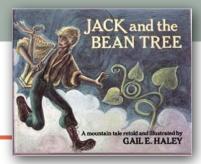
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 - difference in phoneme, difference in gender

Timbre = energy distribution pattern over the frequency axis

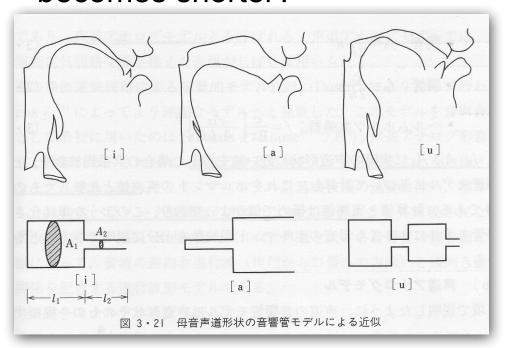
Determined only by the shape of a tube used for sound generation

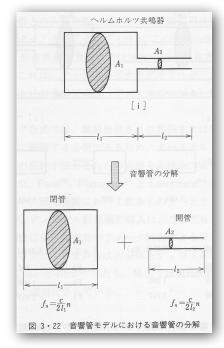


Hearing test 1



 Q : what kind of acoustic change is expected when a vocal tube becomes shorter?





$$f_n = \frac{c}{2l_1}n$$

$$f_n = \frac{c}{2l_2}n$$

$$f = \frac{c}{2\pi} \left[\frac{A_2}{A_1 l_1 l_2} \right]^{1/2}$$



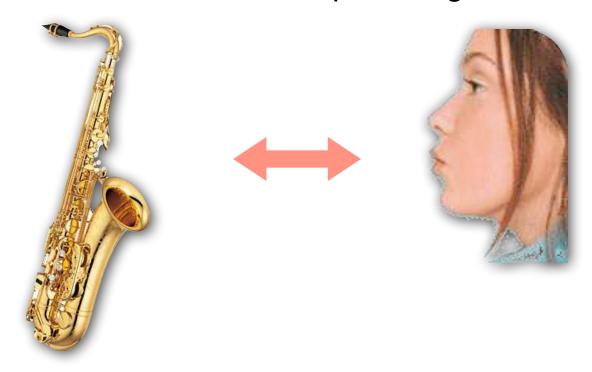
Hearing test 2

• Q : Guess what kind of *tube shape* change happened by hearing the sounds before and after the tube shape change.

$$A \rightarrow B \rightarrow A$$

Hearing test 2

Q: Guess what kind of tube shape change happened by hearing the sounds before and after the tube shape change.



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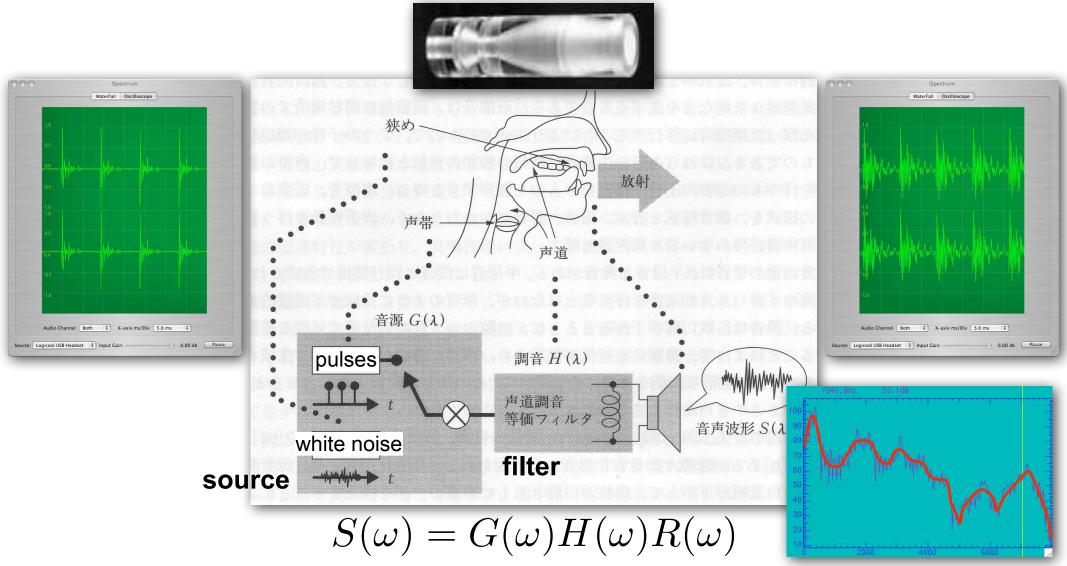




Modeling of speech production

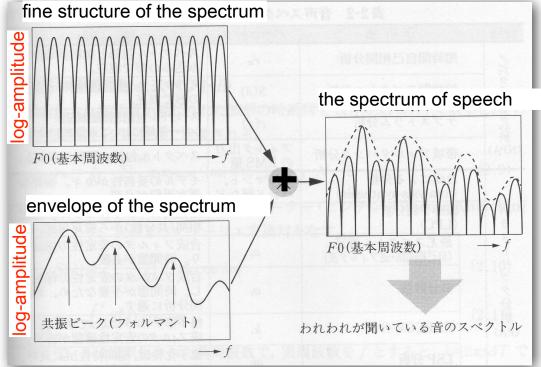
Mathematical modeling of speech production -- source & filter model --

Linear independence between source and filter



Modeling of vowel production

- Mathematical modeling of speech production -- source & filter model --
 - Separation between the spectrums of source and filter

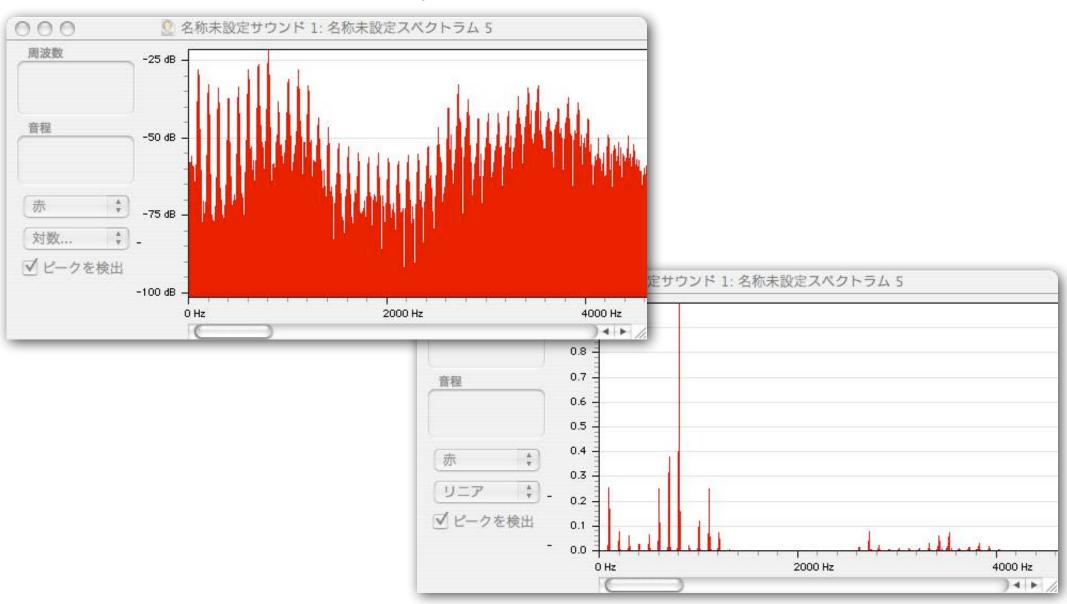






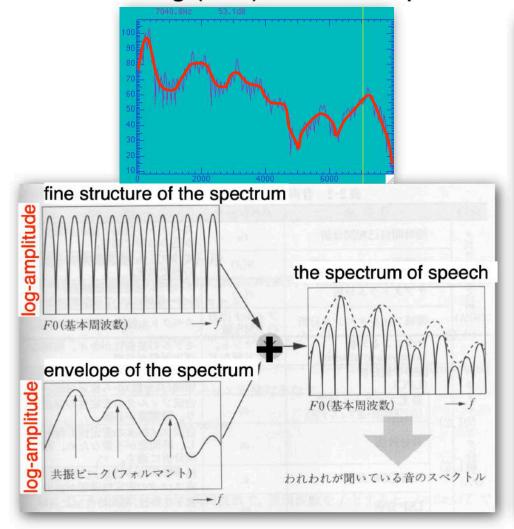
A comment on linear and log spectrums

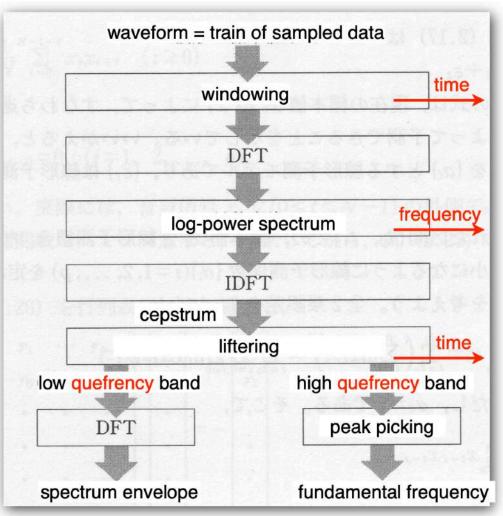
Their appearances are very different.



Extraction of spectrum envelopes

- Cepstrum method
 - Windowing + FFT + log-amplitude --> a spectrum with pitch harmonics
 - Smoothing (LPF) of the fine spectrum into its smoothed version

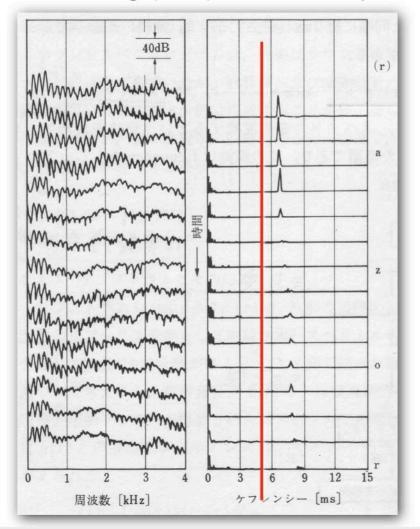


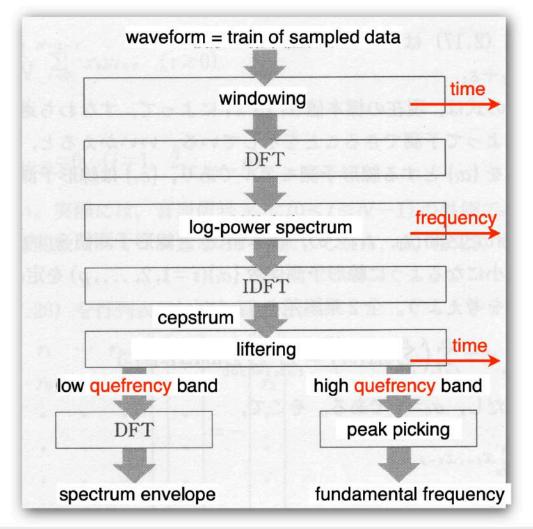


Cognitive Media Processing @ 2015

Extraction of spectrum env

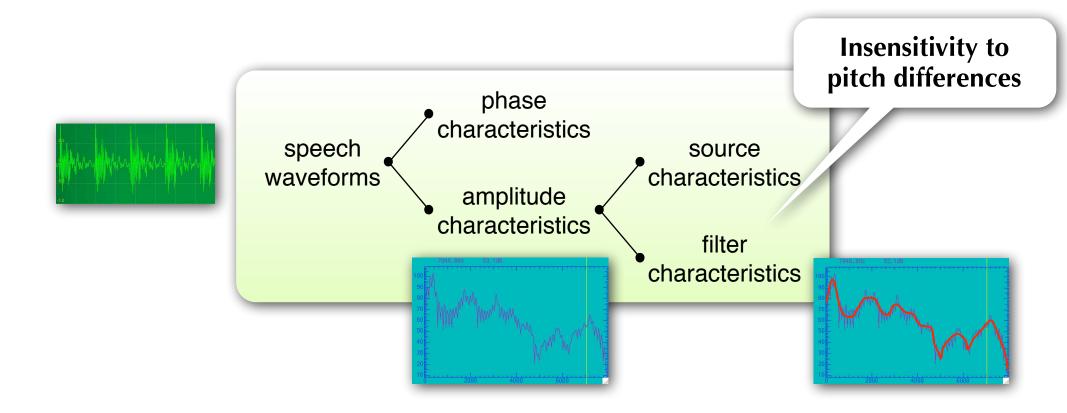
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 - Smoothing (LPF) of the fine spectrum into its smoothed version



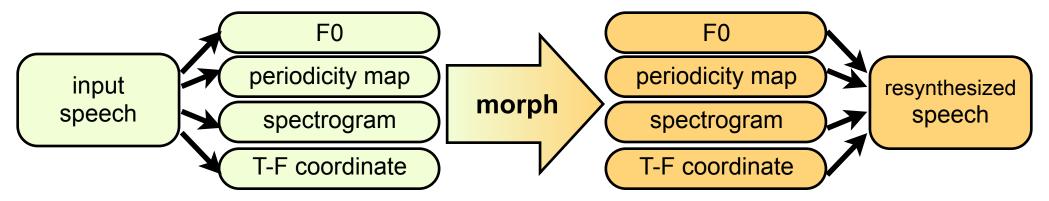


Spectrum to spectrum envelope

- From spectrums to spectrum envelopes
 - log-amplitude spectrum -> smoothing -> spectrum envelope
- Humans' insensitivity to pitch differences when perceiving phonemes.
 - /a/ with high tone and /a/ with low tone are perceived to be of the same class.
 - Separation of pitch (fundamental frequency) can be done by spectrum smoothing.



- STRAIGHT [Kawahara'06]
 - High-quality analysis-resynthesis tool
 - Decomposition of speech into
 - Fundamental frequency, spectrographic representations of power, and that of periodicity
 - High-quality speech morphing tool

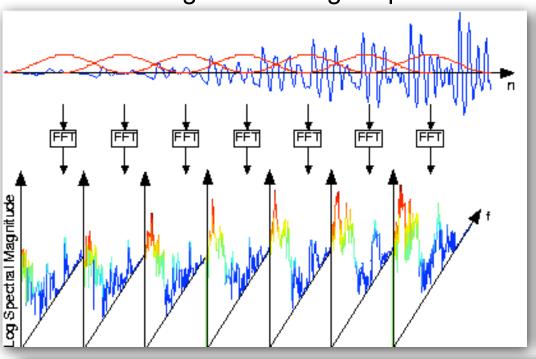


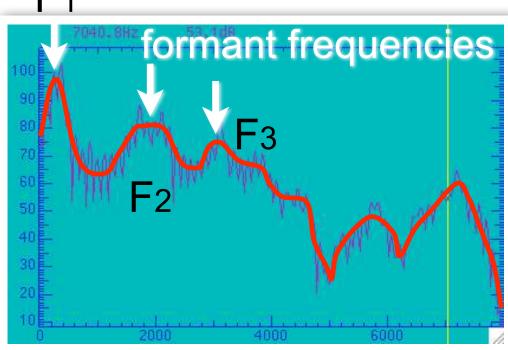
- Spectrographic representation of power
 - F0 adaptive complementary set of windows and spline based optimal smoothing
- Instantaneous frequency based F0 extraction
 - With correlation-based F0 extraction integrated
- Spectrographic representation of periodicity
 - Harmonic analysis based method

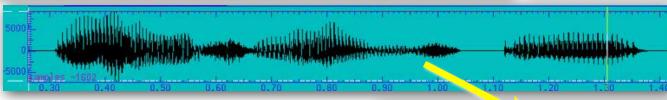
Acoustic phonetics

From waveforms to spectrums

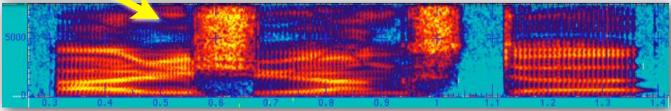
Windowing + FFT + log-amplitudeF1



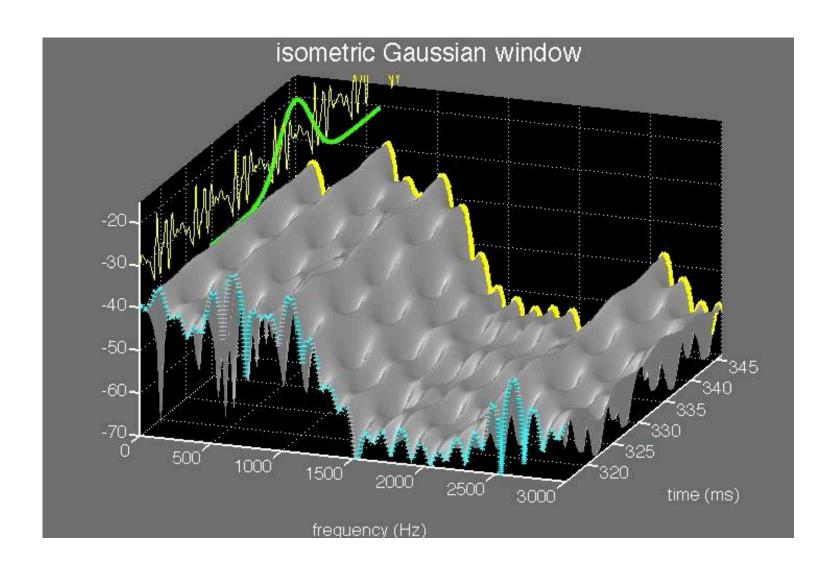




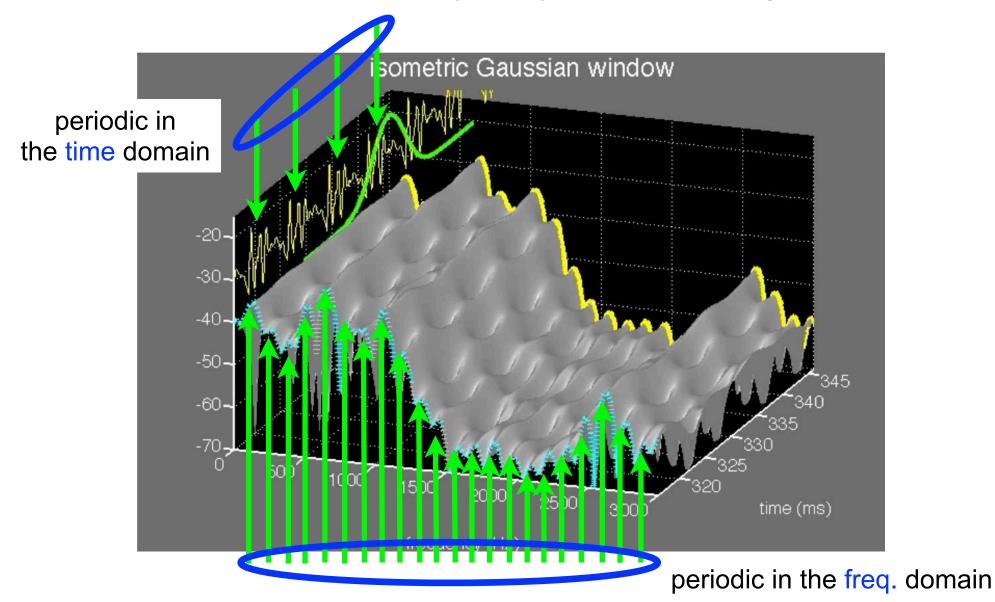
spectrogram



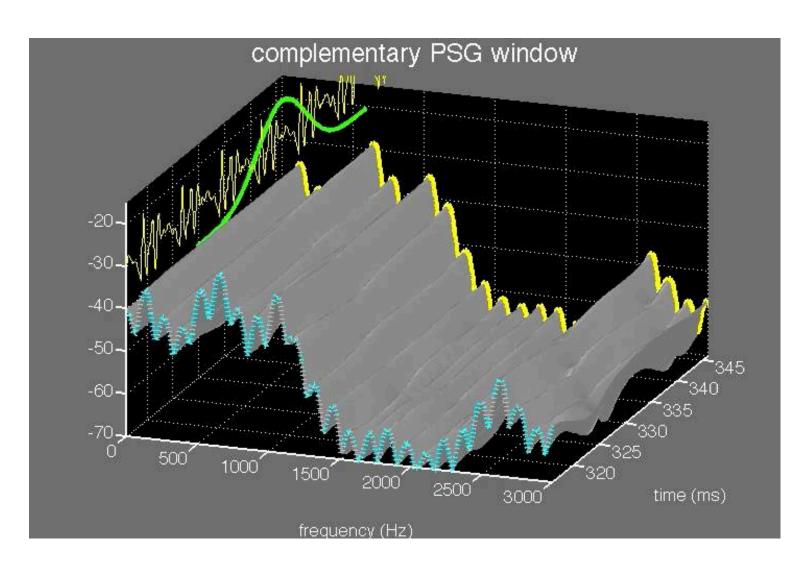
Short Time Fourier Transform (STFT)-based spectrogram



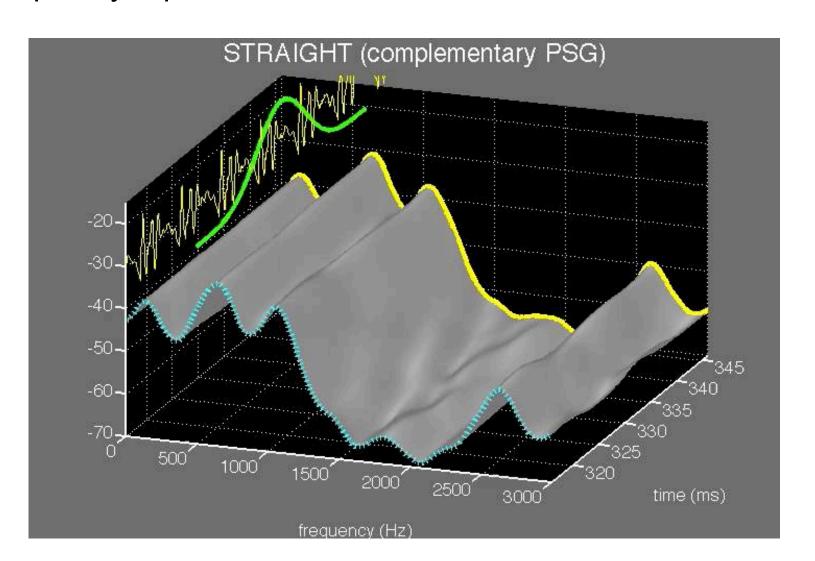
Short Time Fourier Transform (STFT)-based spectrogram



 Complementary pitch-synchronous Gaussian window removes the repetitive structure in the time domain.

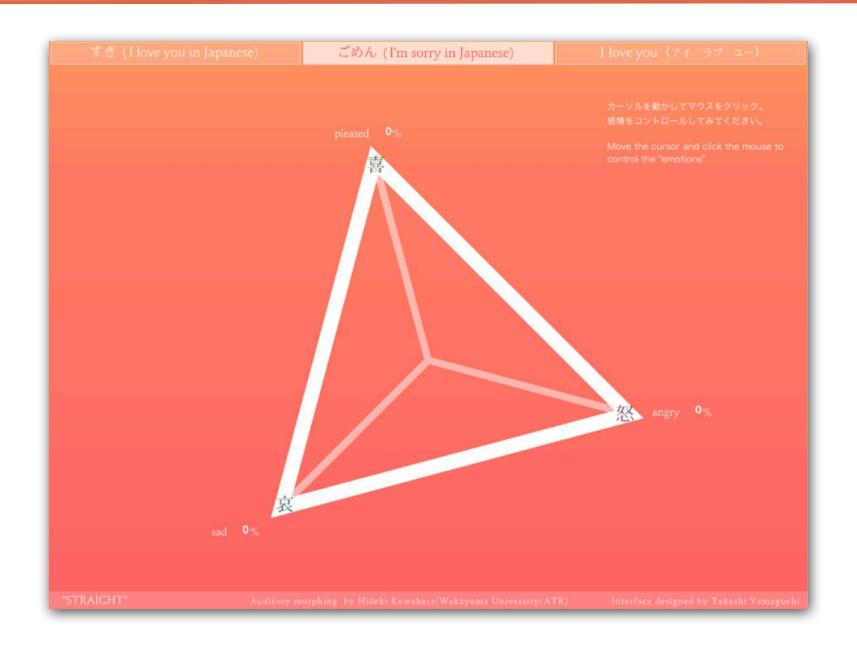


 Spline-based optimum smoothing reconstructs the underlying smooth time-frequency representation.



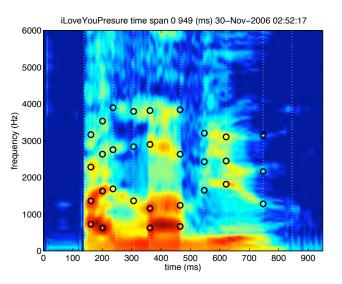
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Examples of speech morphing



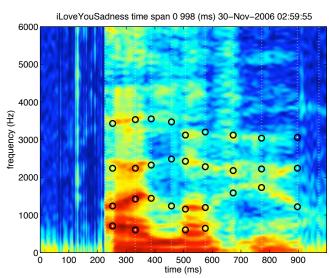
Examples of speech morphing

Morphing with some anchor points

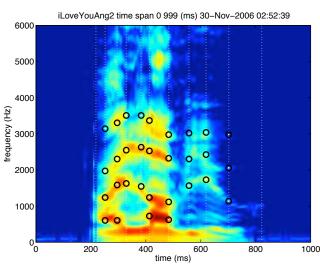


Pleasure

Sadness

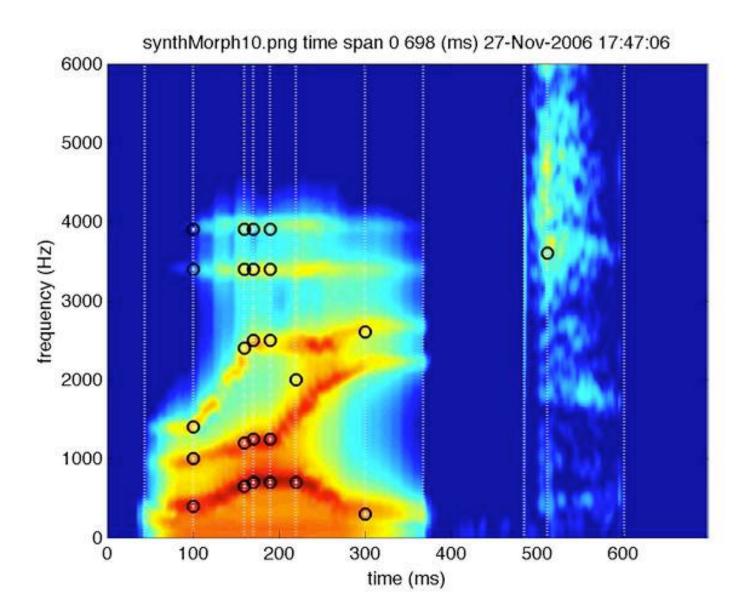


Anger



Examples of speech morphing

R to L morphing bet. r/l-ight generated by Klatt synthesizer [Kubo+'98]



Examples of speech morphing

- Morphing of native utterance and its accented version [Kato+'11]
 - Use of a pair of word utterances spoken by a bilingual speaker
 - Normal Tokyo Japanese
 - Heavily American accented Japanese







igaku (medical science)





spectral envelope & aperiodicity (sp_ap)



F0 & dur (F0_dur)

6.

5.

all the parameters (all)

7. = 2.

0

0.25

0.5

0.75

1

morphing rate

Vocal tract shape and spectrum envelope

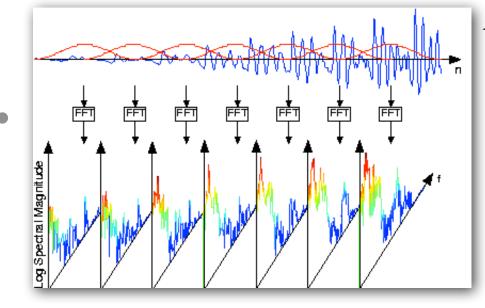
- Linear Predictive Coding (LPC)
 - Speech signal at time t, st, is predicted as weighted addition of some old signals.

$$s_{t} \leftarrow -\sum_{k=1}^{p} \alpha_{k} s_{t-k}$$

$$s_{t} + \sum_{k=1}^{p} \alpha_{k} s_{t-k} = \sum_{k=0}^{p} \alpha_{k} s_{t-k} = \varepsilon_{t} \quad (\alpha_{0} = 1.0)$$

$$S(z) + \alpha_{1} S(z) z^{-1} + \alpha_{2} S(z) z^{-2} + \dots + \alpha_{p} S(z) z^{-p} = E(z)$$

$$S(z) = \frac{1}{1 + \alpha_{1} z^{-1} + \alpha_{2} z^{-2} + \dots + \alpha_{p} z^{-p}} E(z) = A(z) E(z)$$

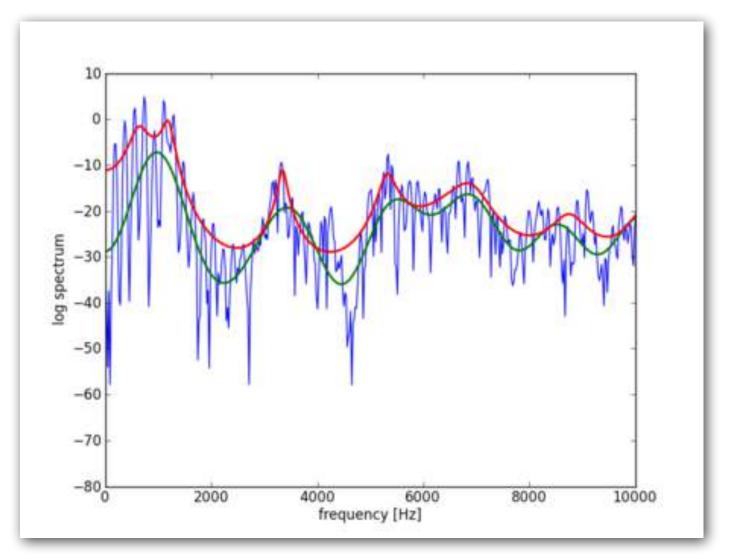


 $\{\alpha_k\}$ are estimated for a frame in such a way that error term for that frame, ε_t , should be minimized.

If error term is assumed to be white noise, then, the spectrum envelope shape is determined by A(z).

Spectrum envelopes by CEP and LPC

- Cepstrum-based envelope is just a smoothed spectrum.
- Spectral peaks are emphasized in LPC-based envelope.

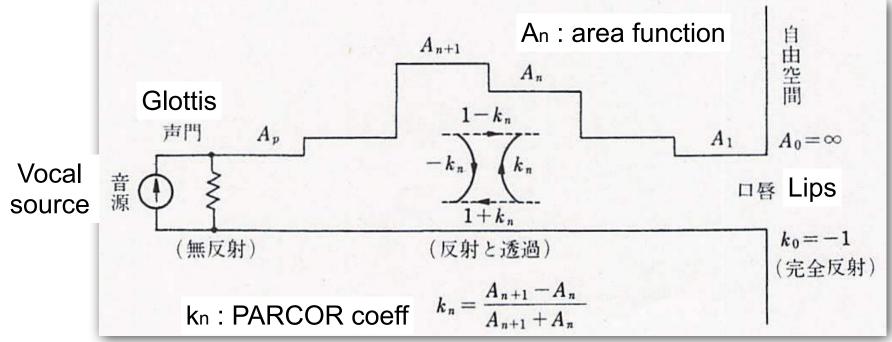


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LPC to vocal tract a

- $\{\alpha_k\}$ to the area function of the vocal tube.
 - LPC coefficients are transformed into PARCOR (PARtial auto-CORrelation) coefficients.
 - PARCOR coeff. are transformed to reflection coefficients between two consecutive short tubes.
 - Finally PARCOR coefficients are related to the cross-sectional area of each short tube.





Cognitive Media Processing

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 - Simple hearing tests
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- Spectrums/waveforms of various language sounds
 - Vowels, semivowels, liquids, nasals, voiced fricatives, unvoiced fricatives, glottals,
 - Voiced plosives, unvoiced plosives, voiced affricatives, and unvoiced affricatives
 - Speech recognition as spectrum reading
- Summary

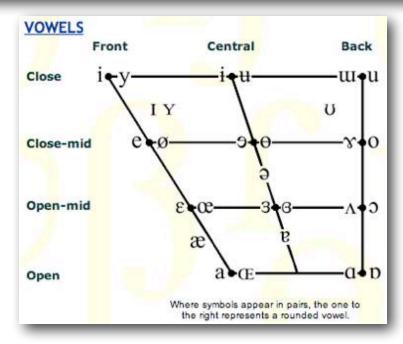




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Various sounds in languages

Plosive	Bilabial		Labiodental	Dent	al	Alveolar	Postalveolar	Rei	Retroflex		Palatal		Velar		Uvular		Pharyngeal		Glottal	
	p	b			t	d		t	þ	c	J	k	g	q	G			?		
Nasal		m	nj			n			η		ŋ		ŋ		N					
<u>Trill</u>		В				r									R					
Tap or Flap						ſ			τ											
Fricative	ф	β	f v	θ	ðs	7	\$ 3	Ş	Z,	ç	j	x	Y	χ	R	ħ	S	h	f	
Lateral fricative					4	ß														
Approximant			υ			I.			-Į		j		щ							
Lateral approximant						1	T S		l		λ		L							

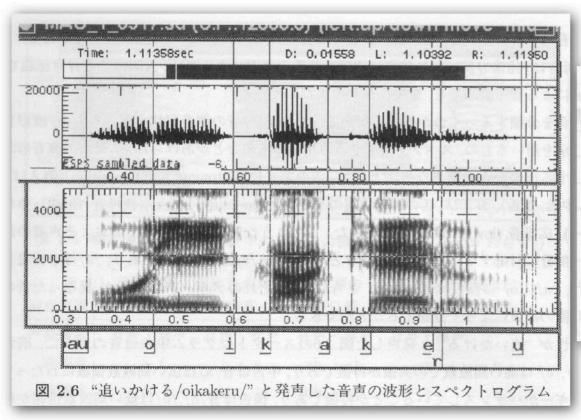


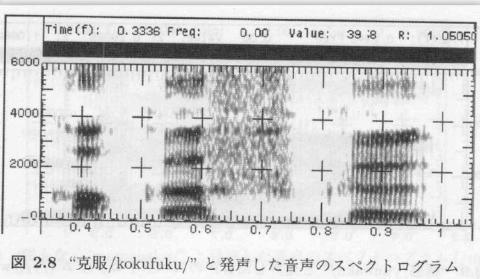
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Vowels

Characteristics of vowels

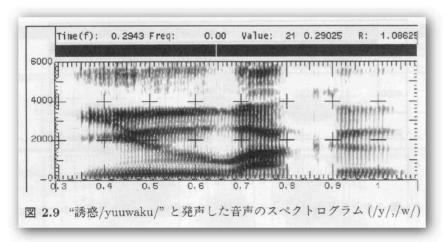
- Front vowels of /i/ and /e/: resonance at higher frequency bands
- Middle vowels of /a/: energy distribution over a wide frequency range
- Back vowels of of /u/ and /o/: lower bands are dominant in energy distribution
- Unvoiced vowels

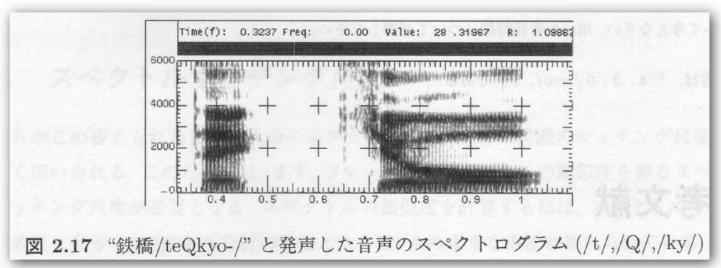




Semivowels and liquids

- Characteristics of semivowels and liquids
 - /w/, /y/, and /r/: characterized by their transitional parts from/to neighboring phones.
 - Large dependency on phonemic context.

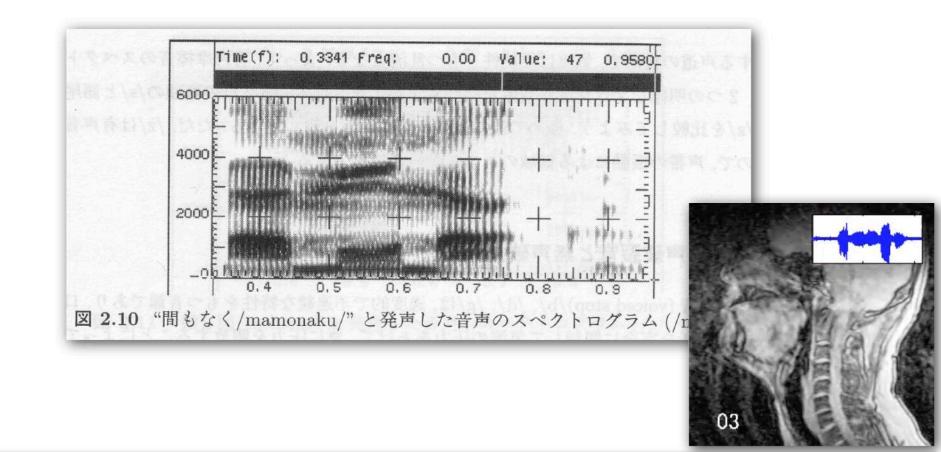




Cognitive Media Processing @ 2015

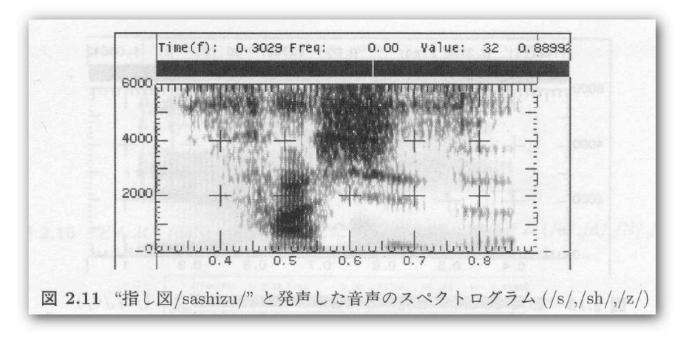
Nasals

- Characteristics of nasals
 - /m/, /n/, /ng/, /N/: a pathway to the nasal cavity shows its own acoustic features.
 - Closed vocal cavity and open nasal cavity cause antiresonance.
 - Transitional parts from/to neighboring vowels are useful in identifying nasal sounds.



Unvoiced fricatives and glottals

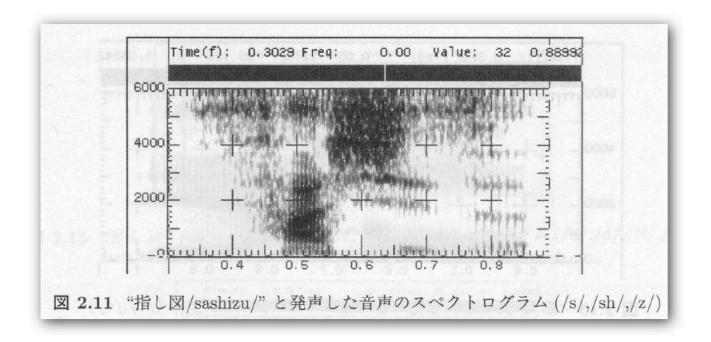
- Characteristics of unvoiced fricatives and glottals
 - /f/, /s/, /sh/: energy distribution at higher frequency bands
 - A vocal cavity from the (almost) closing point to the lung causes antiresonance.



- /h/: fricative at glottis
 - The shape of the vocal cavity is the same as that of the succeeding vowel.
 - No antiresonance

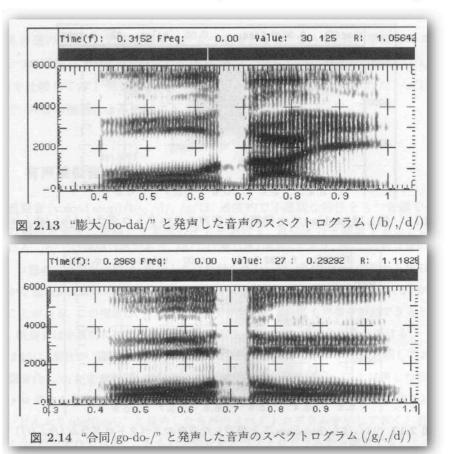
Voiced fricatives

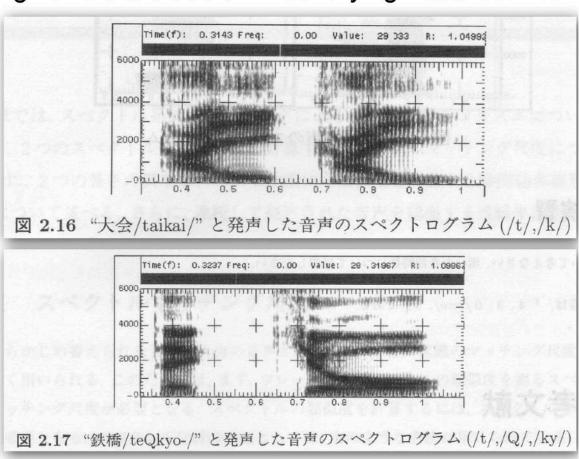
- Characteristics of voiced fricatives
 - /v/, /z/, /zh/: source sounds are generated at two positions, glottal sources and fricative sources
 - Energy distribution is found at a very low frequency band due to the glottal source.



Voiced plosives and unvoiced plosives

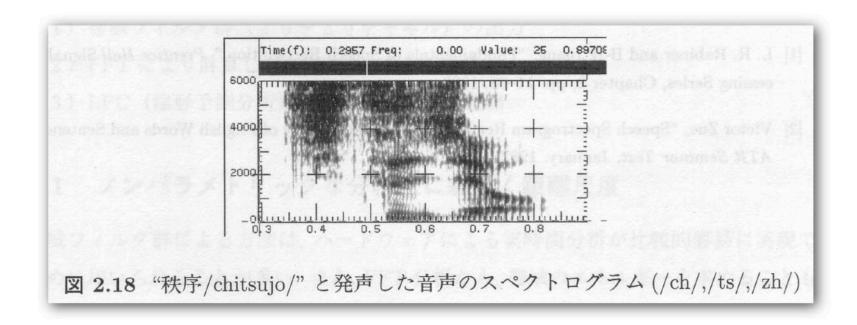
- Characteristics of voiced plosives and unvoiced plosives
 - /b/, /d/, /g/ /p/, /t/, /k/
 - Complete closure in the vocal tract at a time and abrupt release of air flow
 - Buzz-bar: closed vocal tract + vocal fold vibration --> radiation from the skin
 - Transitional parts from/to neighboring vowels are useful in identifying nasal sounds.





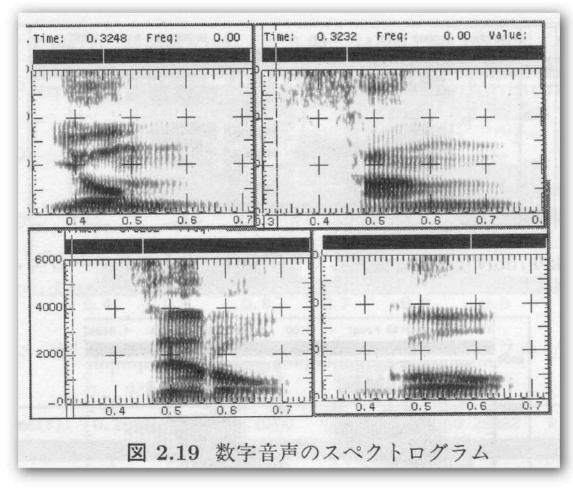
Voiced affricates and unvoiced affricates

- Characteristics of voiced affricates and unvoiced affricates
 - Affricate = plosive + fricative
 - /dz/, /dh/, /ts/, /ch/



Spectrum reading

- What are these?
 - Hint : they are numbers.



This is the task that is done by a speech recognizer.

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Cognitive Media Processing

Recommended books

