

Generating natural-sounding semisynthetic speech stimuli for sociophonetic experiments

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A typical aim of a sociophonetic perception study is to explore the impact of a single variable on a social judgment. Options:

- Use phonetically diverse natural stimuli (e.g. Clopper & Pisoni, 2004)
- Use stimuli performed by variable speakers (e.g. Evans & Iverson, 2004)
- Use stimuli performed by phoneticians (e.g. Kubisz, 2014)
- Use synthetic or semisynthetic stimuli (e.g. Kendall & Fridland, 2012; Hay, Warren & Drager, 2006)

Introduction

Parametric
synthesis

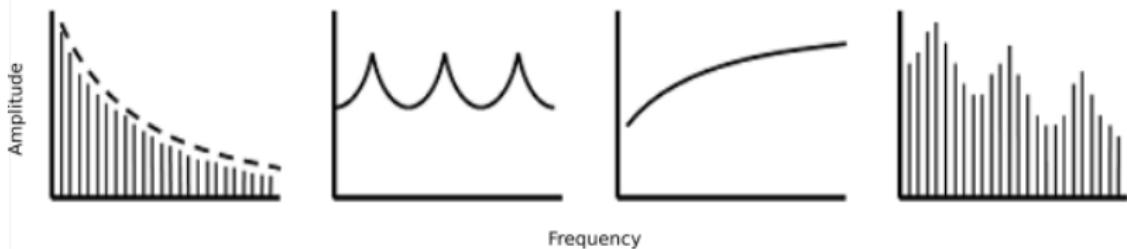
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Basic source-filter theory (Fant, 1960):

- Treat the speech signal as a combination of a sound source and vocal tract resonances, plus the effect of radiation from the lips:



Source
(represents
glottal flow)

Filter
(represents vocal
tract setting)

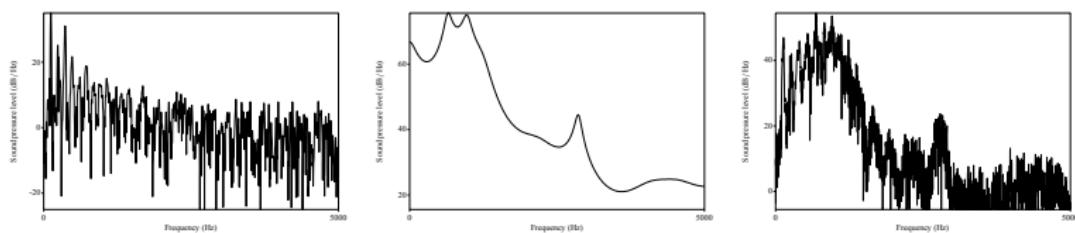
Radiation
characteristic
(represents effect
of sound passing
out of vocal tract
and into the
world)

Speech spectrum

Parametric synthesis

Basic source-filter theory (Fant, 1960):

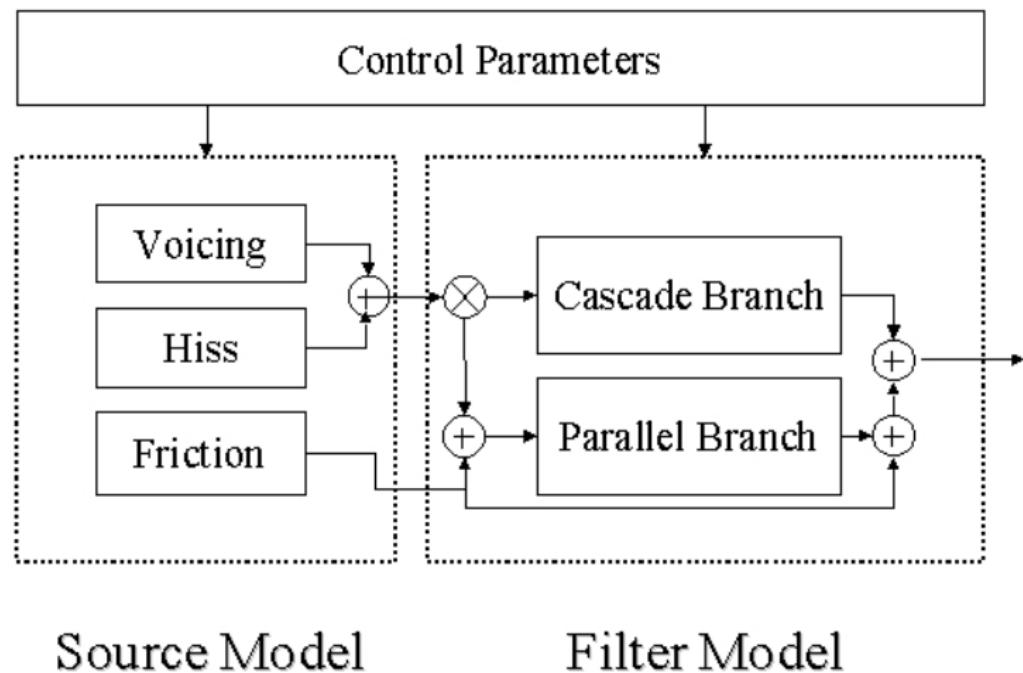
- Treat the speech signal as a combination of a sound source and vocal tract resonances, plus the effect of radiation from the lips:



- To synthesize speech, we need to generate an excitation source and pass it through a set of digital filters

Parametric synthesis:

- Basic schematic of the Klatt (1980) synthesizer



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Parametric
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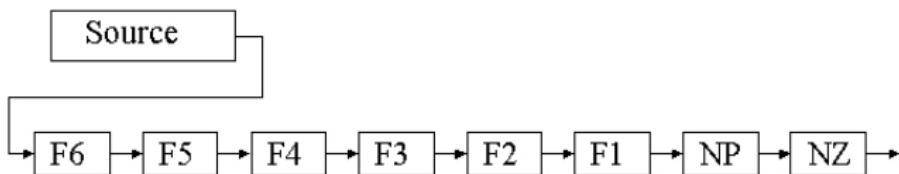
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Parametric synthesis:

- Cascade branch of the Klatt (1980) synthesizer



- Each filter boosts the frequencies to match the resonances it represents.

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In practice:

- Specify parameters for every time point.

N	V/C	Sym	Name	Min	Max	Typ
1	V	AV	Amplitude of voicing (dB)	0	80	0
2	V	AF	Amplitude of friction (dB)	0	80	0
3	V	AH	Amplitude of aspiration (dB)	0	80	0
4	V	AVS	Amplitude of sinusoidal voicing (dB)	0	80	0
5	V	F0	Fundamental freq. of voicing (Hz)	0	500	0
6	V	F1	First formant frequency (Hz)	150	900	450
7	V	F2	Second formant frequency (Hz)	500	2500	1450
8	V	F3	Third formant frequency (Hz)	1300	3500	2450
9	V	F4	Fourth formant frequency (Hz)	2500	4500	3300
10	V	FNZ	Nasal zero frequency (Hz)	200	700	250
11	C	AN	Nasal formant amplitude (dB)	0	80	0
12	C	A1	First formant amplitude (dB)	0	80	0
13	V	A2	Second formant amplitude (dB)	0	80	0
14	V	A3	Third formant amplitude (dB)	0	80	0
15	V	A4	Fourth formant amplitude (dB)	0	80	0
16	V	A5	Fifth formant amplitude (dB)	0	80	0
17	V	A6	Sixth formant amplitude (dB)	0	80	0
18	V	AP	Bypass path amplitude (dB)	0	80	0
19	V	B1	First formant bandwidth (Hz)	40	500	50
20	V	B2	Second formant bandwidth (Hz)	40	500	70
21	V	B3	Third formant bandwidth (Hz)	40	500	110
22	C	SW	Cascade/parallel switch	0(CASC)	1(PARA)	0
23	C	FCP	Glottal resonator 1 frequency (Hz)	0	500	0
24	C	BGP	Glottal resonator 1 bandwidth (Hz)	100	2000	100
25	C	FG2	Glottal zero frequency (Hz)	0	5000	1500
26	C	BG2	Glottal zero bandwidth (Hz)	100	9000	6000
27	C	B4	Fourth formant bandwidth (Hz)	100	500	250
28	V	F5	Fifth formant frequency (Hz)	3500	4900	3750
29	C	B5	Fifth formant bandwidth (Hz)	150	700	200
30	C	F6	Sixth formant frequency (Hz)	4000	4999	4900
31	C	B6	Sixth formant bandwidth (Hz)	200	2000	1000
32	C	FNP	Nasal pole frequency (Hz)	200	500	250
33	C	BNP	Nasal pole bandwidth (Hz)	50	500	100
34	C	BNZ	Nasal zero bandwidth (Hz)	50	500	100
35	C	BGS	Glottal resonator 2 bandwidth	100	1000	200
36	C	SPR	Sampling rate	5000	20 000	10 000
37	C	NWS	Number of waveform samples per chunk	1	200	50
38	C	G0	Overall gain control (dB)	0	80	47
39	C	NFC	Number of cascaded formants	4	6	5

Parametric synthesis

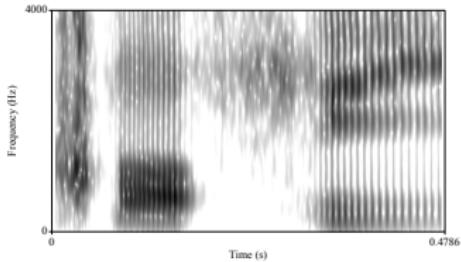
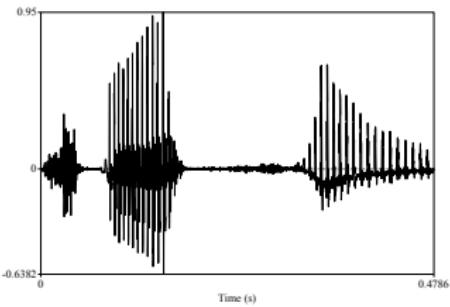
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Play

Parametric synthesis in Praat:

- Praat implements the Klatt synthesizer through 'KlattGrid' objects
- You can imagine these as 2D grids with time on the X-axis and the Klatt settings on the Y-axis
- <http://www.fon.hum.uva.nl/praat/manual/KlattGrid.html>

¹ #Create a KlattGrid

```
Create KlattGrid... aa 0 0.5 6 1 1 6 1 1 1
```

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Parametric synthesis in Praat:

```
#Add voicing amplitude, vowel formants, and pitch
targets
2 Add voicing amplitude point... 0.0 0
Add voicing amplitude point... 0.04 90
4 Add voicing amplitude point... 0.25 90
Add voicing amplitude point... 0.5 90
6 Add pitch point... 0.0 150
Add pitch point... 0.5 150
```

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Parametric synthesis in Praat:

```
1 Add oral formant frequency point... 1 0.1 750
Add oral formant bandwidth point... 1 0.1 70
3 Add oral formant frequency point... 2 0.1 1250
Add oral formant bandwidth point... 2 0.1 120
5 Add oral formant frequency point... 3 0.1 2500
Add oral formant bandwidth point... 3 0.1 200
7 Add oral formant frequency point... 4 0.1 3900
Add oral formant bandwidth point... 4 0.1 300
9 #Synthesis
Play
11 To Sound
```

- Can you modify the code to generate a high front vowel?
- What about a diphthong?
- Try running 'klatt_cardinal.psc'

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Pros of fully-parametric synthesis:

- Fine-grained control over parameters
- Given unlimited time and accurate measurements of the parameters of a source item, in principle possible to synthesize any speech sound
- Stimuli fully replicable as long as parameters are published

Cons of fully-parametric synthesis:

- Properties of the glottal source particularly difficult to imitate.
- This means that tokens often have a ‘robotic’ quality – perhaps not appropriate for some sociophonetic applications.
- Parameter-setting can be very time consuming, particularly if we want to model dynamic properties of vowels.

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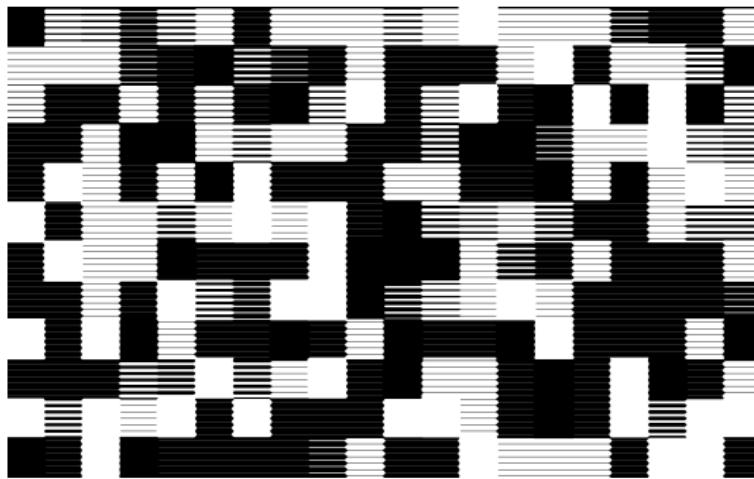
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An alternative: LPC inverse-filtering

- This technique has been implemented in a number of sociophonetic studies – as far back as Graff, Labov & Harris, 1984.
- Detailed technical outline in Alku et al. 1999
- This is what Bartek Plichta's *Akustyk* does...
- ...although I don't know the details of how BP has implemented it.

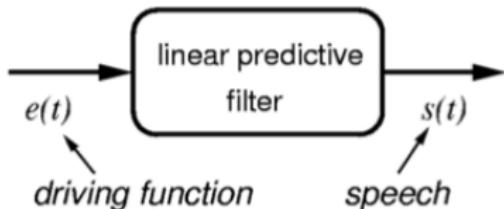
Linear Predictive Coding

- A technique for estimating the spectral envelope of a time-varying speech signal.
- Origins in early television encoding – black and white TV images are 3D grids ($x,y,brightness$) which vary over time.



- However, values do not vary randomly – the brightness of any point is likely to be related to the adjacent points

Linear Predictive Coding



$$\hat{s}(t) = \sum_{j=1}^p a_j s(t-j)$$

$$s(t) = e(t) + \sum_{j=1}^p a_j s(t-j)$$

t = discrete time; p = filter order

Image courtesy of Simon King

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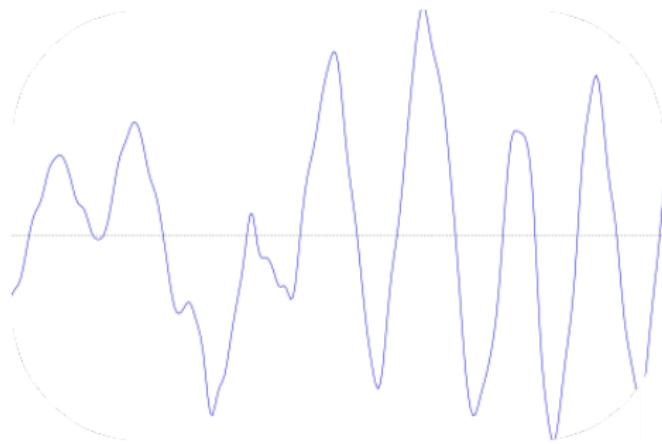
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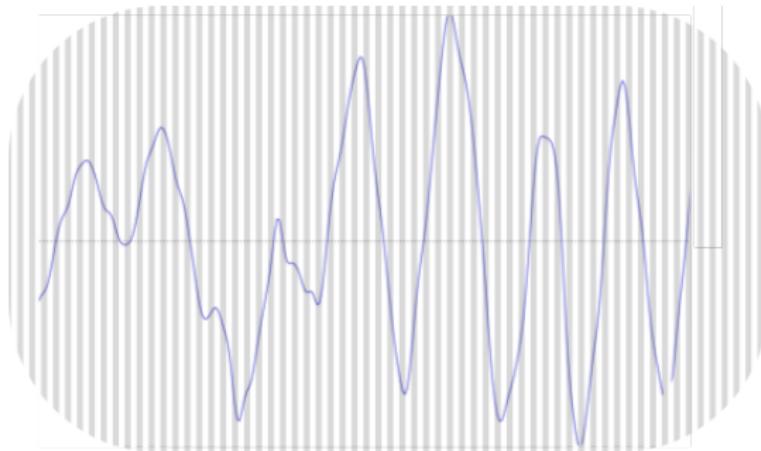
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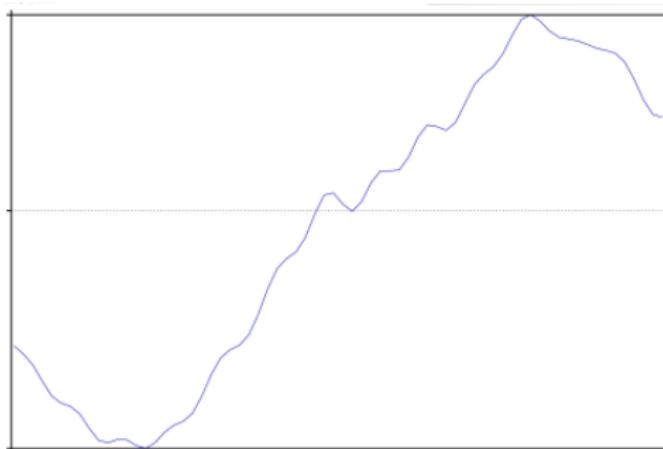
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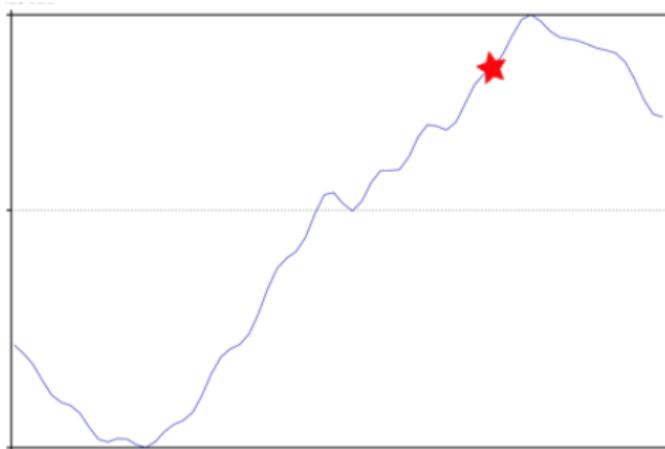
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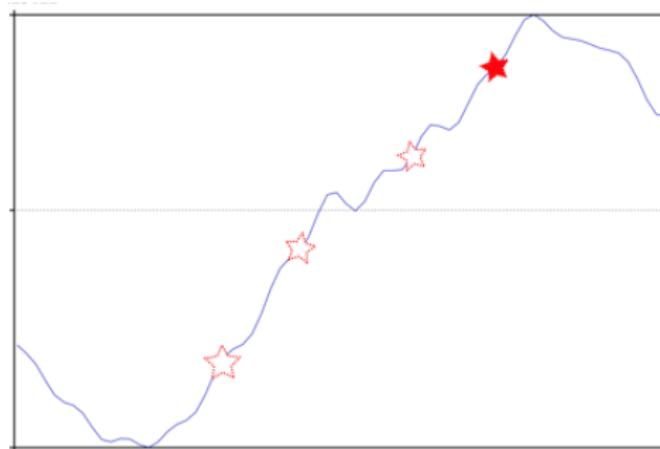
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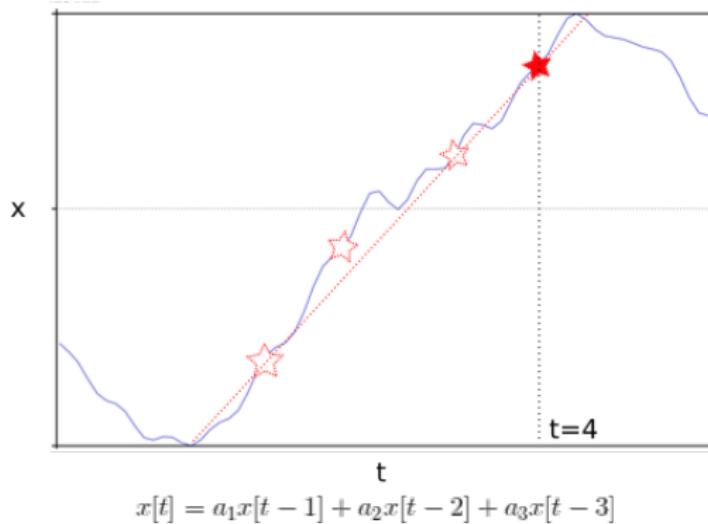
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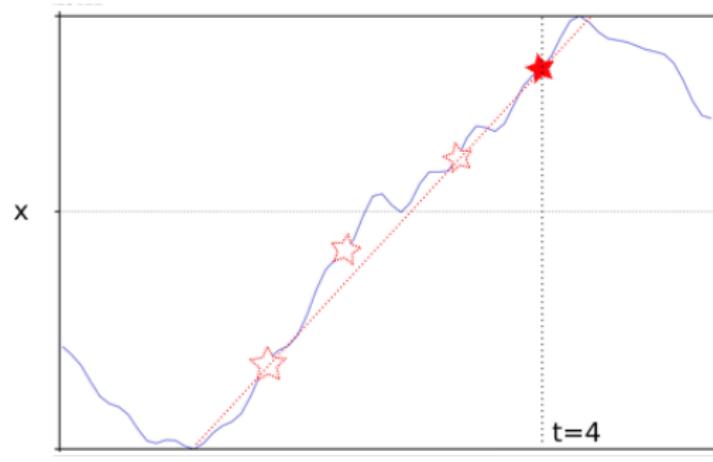
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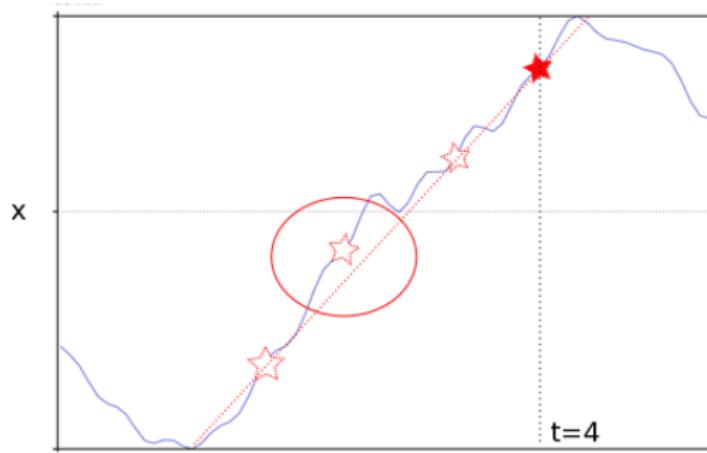


$$x[t] = a_1 x[t - 1] + a_2 x[t - 2] + a_3 x[t - 3]$$

$$[a_1 \quad a_2 \quad a_3]$$

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$$x[t] = a_1 x[t - 1] + a_2 x[t - 2] + a_3 x[t - 3]$$

$$[a_1 \quad a_2 \quad a_3]$$

Linear Predictive Coding

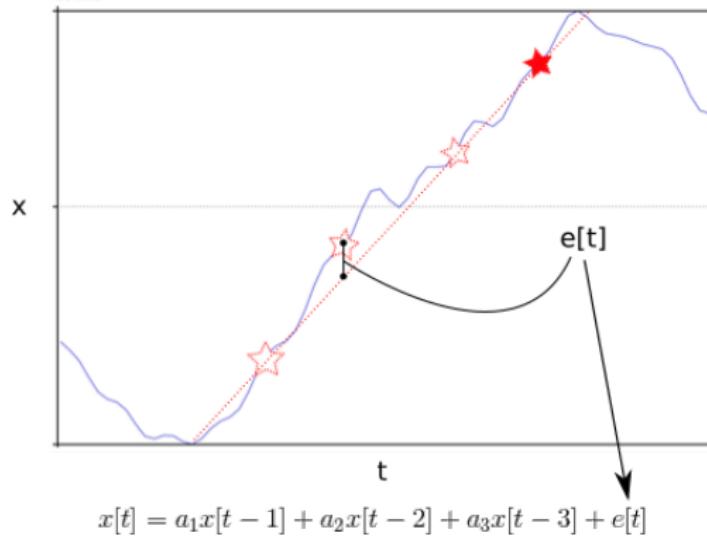
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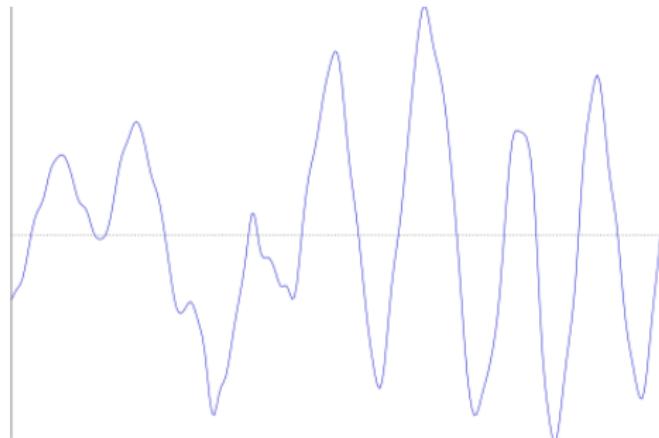
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$$[a_1 \ a_2 \ a_3 \ \dots \ a_n]$$

LPC coefficients

$$[e_1 \ e_2 \ e_3 \ e_4 \ \dots \ e_s]$$

LPC residual

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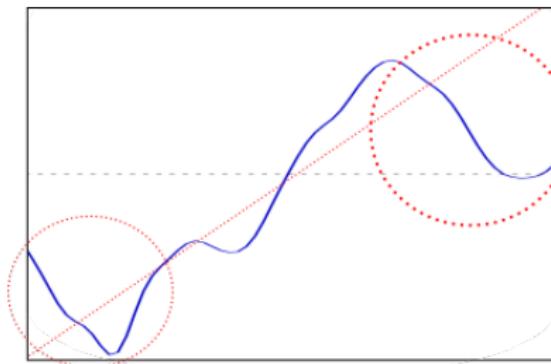
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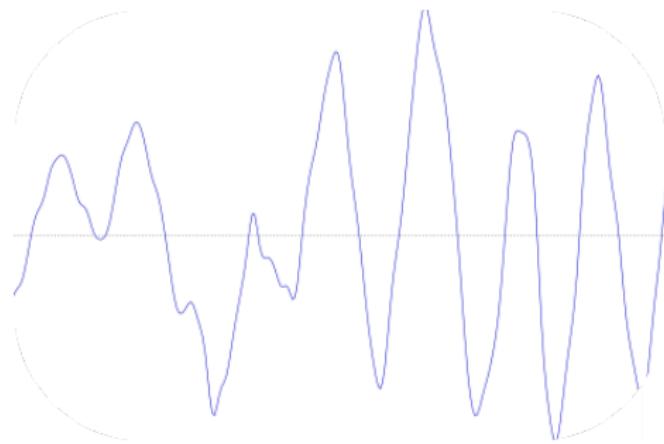
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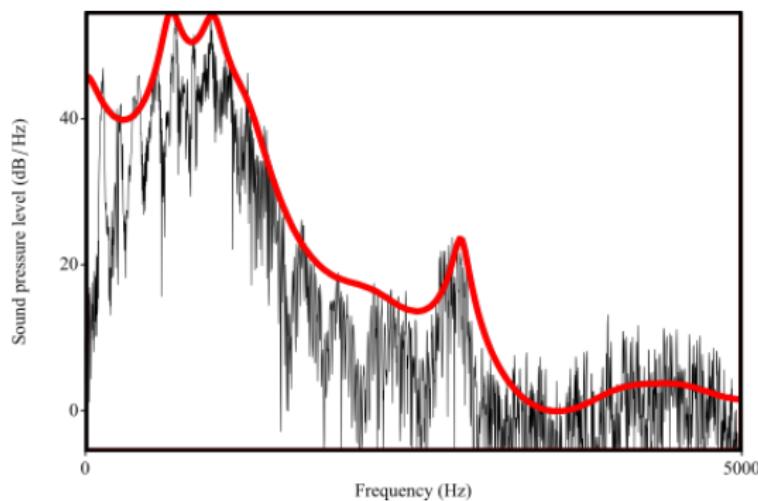
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Linear Predictive Coding

- Estimating the LPC filter is an optimization problem – we find the best set of a values for the given signal
- The difference between the LPC model and the actual signal is the *prediction residual* – together, the estimated LPC filter and residual encode the entire signal:

$$e(n) = x(n) - \hat{x}(n)$$

- Because the largest errors tend to be around the largest changes in the signal, the residual approximates the pitch periods, ‘whitening’ the signal by removing spectral characteristics.

Semisynthetic Speech Stimuli for Sociophonetic Experiments

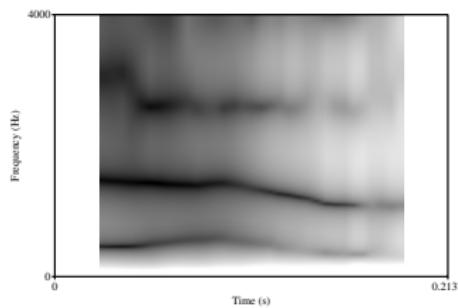
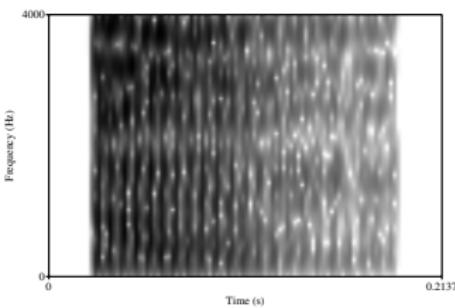
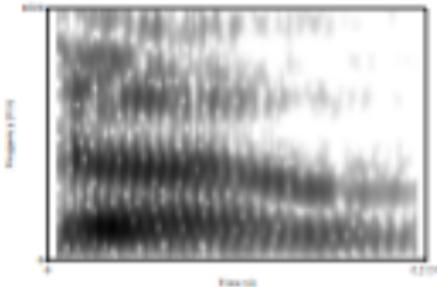
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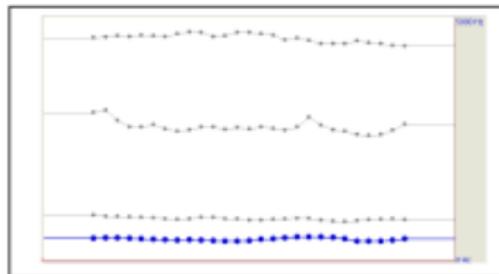
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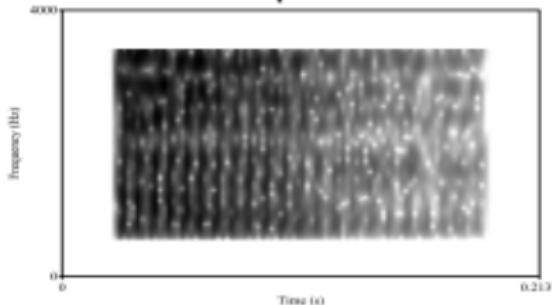
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- Now we can excite a digital filter bank with our natural source representation

Modified filter



Source representation



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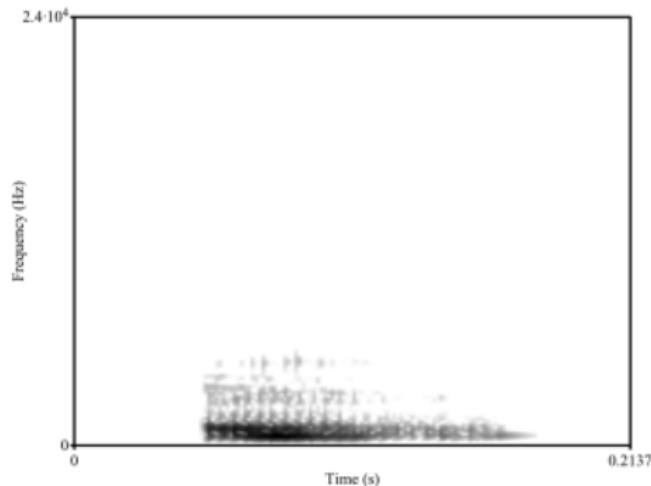
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- Problem: LPC analysis results in the loss of the high-frequency component of the original sound



Play

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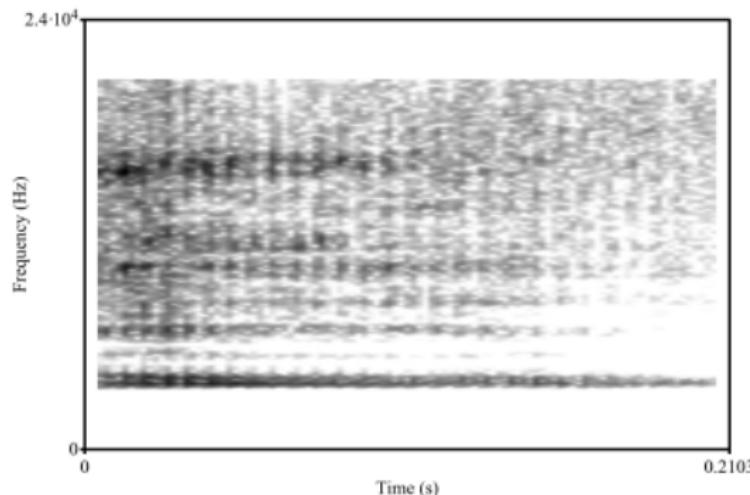
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- Solution: Restore the HF component of the original sound after synthesis



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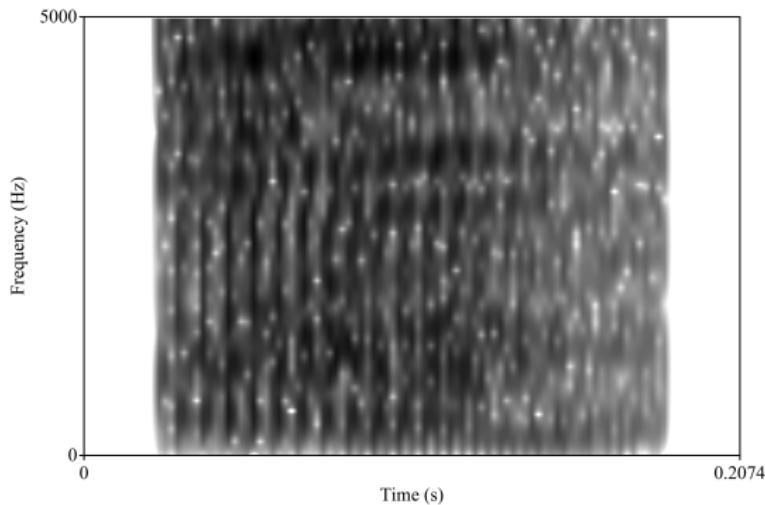
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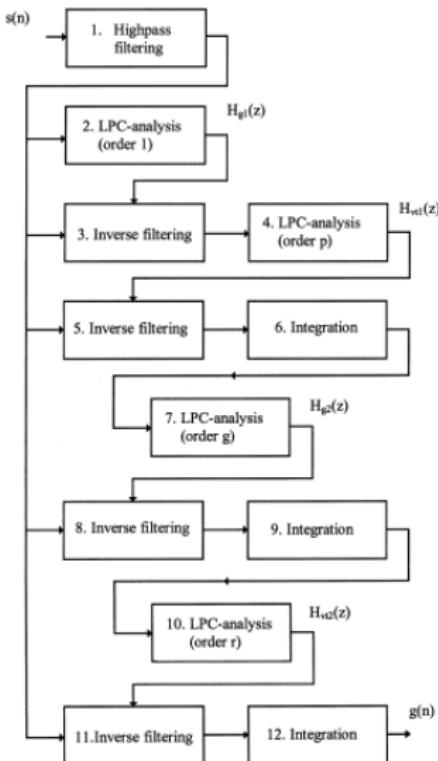
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- Problem: How can we ensure that we have a good source model?



- Solution: Following Alku (1992), filter iteratively, estimating spectral characteristics of glottal flow and vocal tract with different LPC orders



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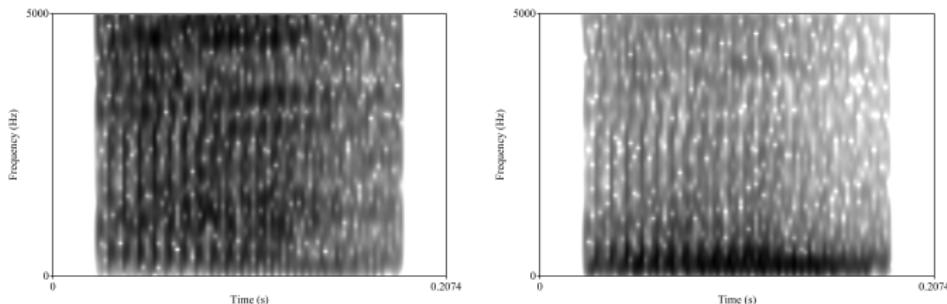
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- Result: very high quality source-filter separation



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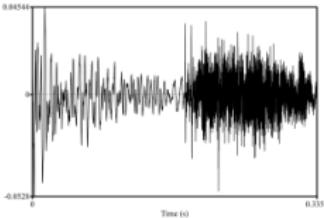
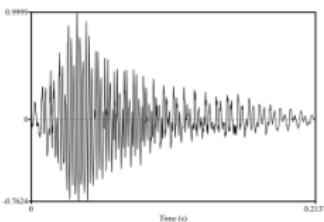
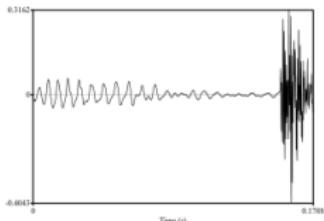
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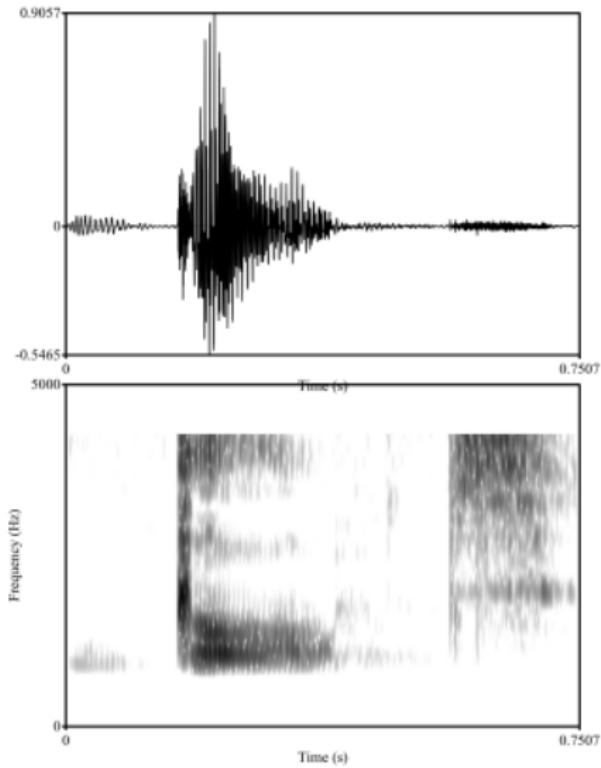
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- Finally, embed the vowel in a lexical item by splicing at zero-crossing points



- End result:



Play

Complete process

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LPC inverse-filtering in Praat:

```
1 #Estimate the LPC filter for a selected sound
#First we need to resample
3 Resample: 10000, 50
To LPC (burg): 8, 0.025, 0.005, 50
```

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```
#Take the inverse of this filter to get a
representation of the source
2 selectObject: "Sound untitled_10000"
plusObject: "LPC untitled_10000"
4 Filter (inverse)
```

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```
#Generate a formant object and add 400 Hz to F2
2 selectObject: "LPC untitled_10000"
To Formant
4 selectObject: "Formant untitled_10000"
Formula (frequencies): "if row = 2 then self + 400
else self fi"
```

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```
1 #Combine the source and filter representations to
   make a new vowel
2 selectObject: "LPC untitled_10000"
3 selectObject: "Sound untitled_10000"
4 plusObject: "Formant untitled_10000"
5 Filter
6 Play
```

- Try recording yourself producing a vowel (ctr+r). Select your vowel token and run 'LPC_cardinal_iaif.praat'

- A range of options available when preparing perception experiments
- Trade off between naturalness and control of phonetic detail
- In some cases, the face validity of the experiment may be more important than others
- In some cases, a lack of naturalness might even strengthen our arguments!
- Importance of explicitness about manipulation methods: no black boxes
- *Praat* is capable of very sophisticated analysis and manipulations, and is open source

References

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- Formant manipulation script on Github:
<https://github.com/danielplawrence/semisynthetic>
- Will Styler's resynthesis scripts: https://github.com/stylerw/styler_praat_scripts/tree/master/source_filter_vowel_resynth
- Similar stuff from Sam Kirkham:
<http://samkirkham.com/scripts/index.html>
- Instructions for source-filter synthesis in *Praat*:
http://www.fon.hum.uva.nl/praat/manual/Source-filter_synthesis.html
- PraatR: <http://www.aaronalbin.com/prastr/>