

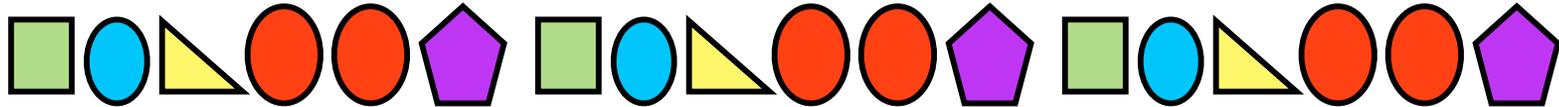
# Rhythm: patterns of events in time

Acc.V Spot Magn Det WD |-----| 500  $\mu$ m  
5.00 kV 3.0 50x SE 28.4

[www.cariani.com](http://www.cariani.com)

# 1. Rhythmic pattern induction & expectation

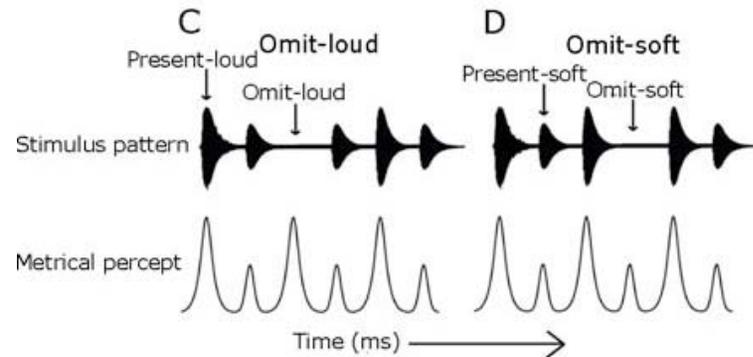
## chunking of repeating patterns



## 2. Meter --

**the inferred metrical grid**

## 3. The Time Sense



Source: Snyder, J. S., and E. W. Large. "Gamma-band Activity Reflects the Metric Structure of Rhythmic Tone Sequences." *Cog Brain Res* 24 (2005): 117-126. Courtesy Elsevier, Inc., <http://www.sciencedirect.com>.  
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Image of Salvador Dali's painting "The Persistence of Memory"  
removed due to copyright restrictions.

See [http://en.wikipedia.org/wiki/File:The\\_Persistence\\_of\\_Memory.jpg](http://en.wikipedia.org/wiki/File:The_Persistence_of_Memory.jpg)

# Rhythm: patterns of events in time

What is rhythm? Perceived patterns of events in time

What constitutes an event? What makes events salient (accented)?

How many individual events can we distinguish (< 12/sec)?

Auditory sense and the time sense (**supramodal**)

- **Perception of duration, weber fractions for time**

Rhythmic pattern induction & expectation

- **Rhythmic pattern invariance w. respect to tempo**

Meter (**regular underlying grid of accented/nonaccented events**)

Rhythmic hierarchies, rhythmic complexity

Small integer-ratios again: models (**clock, oscillator, timing net**)

Polyrhythms; analogy to polyphony

Interactions between melody & rhythm: accents

Rhythms: musical, body, and brain; kinesis

# Music notation: time durations

Fig. 2.2 in Sethares, W. A. *Rhythm and Transforms*.  
Springer, 2007. ISBN: 9781846286391. Preview in [Google Books](#).

# Tempo (absolute timescale, in beats/minute)

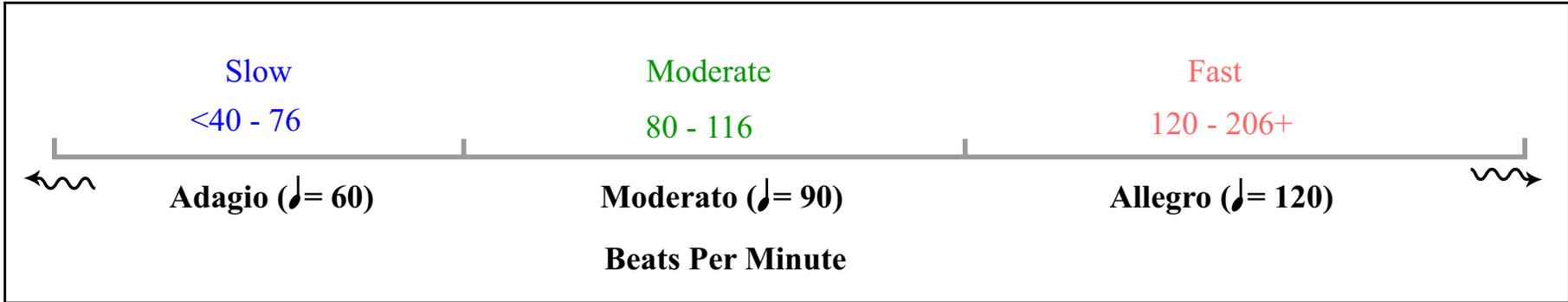


Figure by MIT OpenCourseWare.

# Tempo

**Ranges of events; intervals from 50 ms to 2 sec**

**Too short: events fuse**

**Too long: successive events don't cohere, interact**

**Pitch ( $> 30$  Hz); infra-pitch (10-30 Hz); rhythm ( $< 10$  Hz)**

**For a brisk tempo of 120 bpm, 2 Hz,**

**a quarter note is 500 msec (2 Hz)**

**an eighth note is 250 msec (4 Hz)**

**a sixteenth note is 125 ms (8 Hz)**

**a 32nd note is 62 ms (16 Hz)**

# Rhythm: general observations I

- **Different levels of temporal organization**
  - Handel's basketball game analogy:
- **Patterning**
  - Rhythm: perception of grouping & ordering of events
- **Perceptual groupings of events in time create perceived rhythmic patterns**
- **Temporal pattern expectancies create groupings**
  - pattern repetition and
  - similar patterns of salient auditory contrasts (accents)
- **Underlying temporal framework**
  - (metrical grid, meter, tempo)

# Rhythm: recurring patterns of events in time

Every repeating pattern creates an expectancy of its continuation

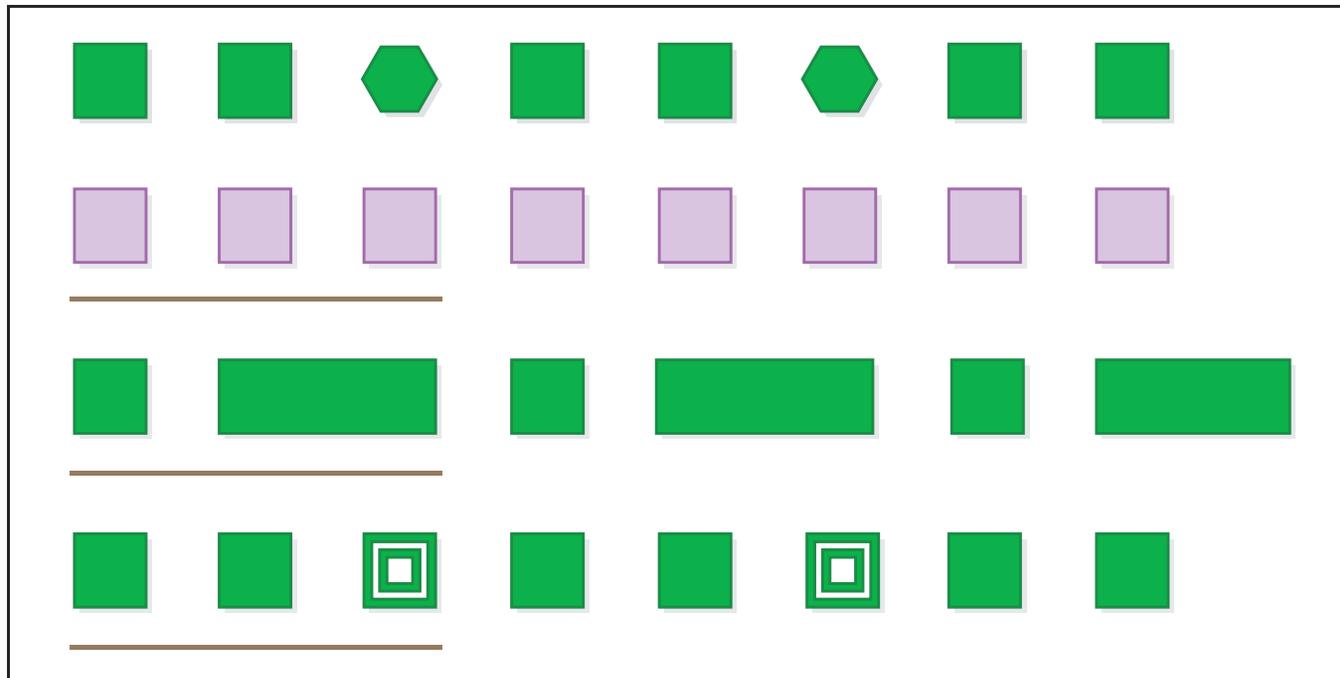


Figure by MIT OpenCourseWare.

**Every repeating pattern creates an expectancy of its continuation**

**Further, there is a “chunking” of the repeating pattern (the invariant pattern becomes an object)**

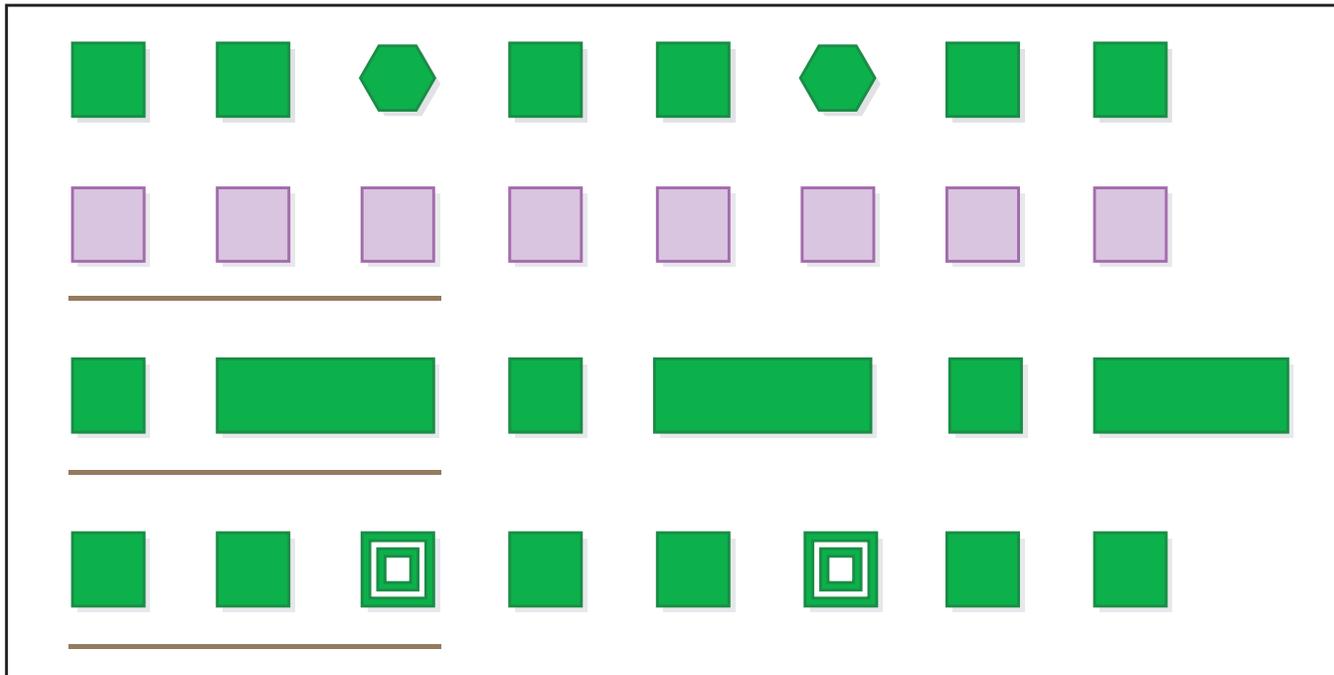


Figure by MIT OpenCourseWare.

# Rhythm generation demonstration

- Repeating patterns of events
- Drum score representation
- Synthesizer

# Acoustical grouping

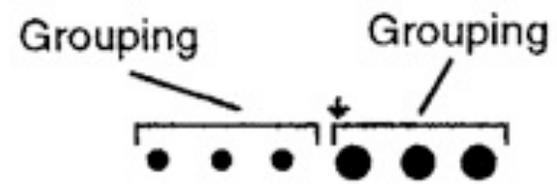
(Snyder, Music & Memory)

## SIMILARITY

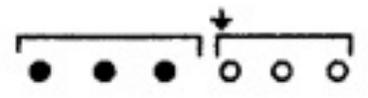
### Sequential Grouping

(Arrows indicate point of realization of change.)

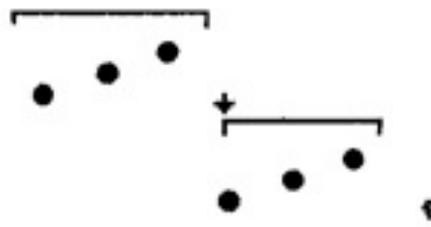
Change in loudness



Change in timbre



Change in pitch interval



### Simultaneous Grouping

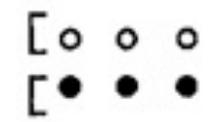
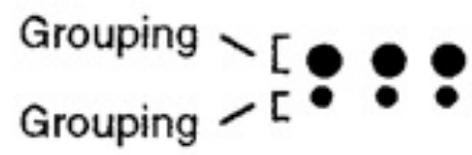


Figure 3.5  
Acoustical grouping.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000. Courtesy of MIT Press.  
Used with permission.

# Melodic & rhythmic grouping

(Snyder, Music & Memory)

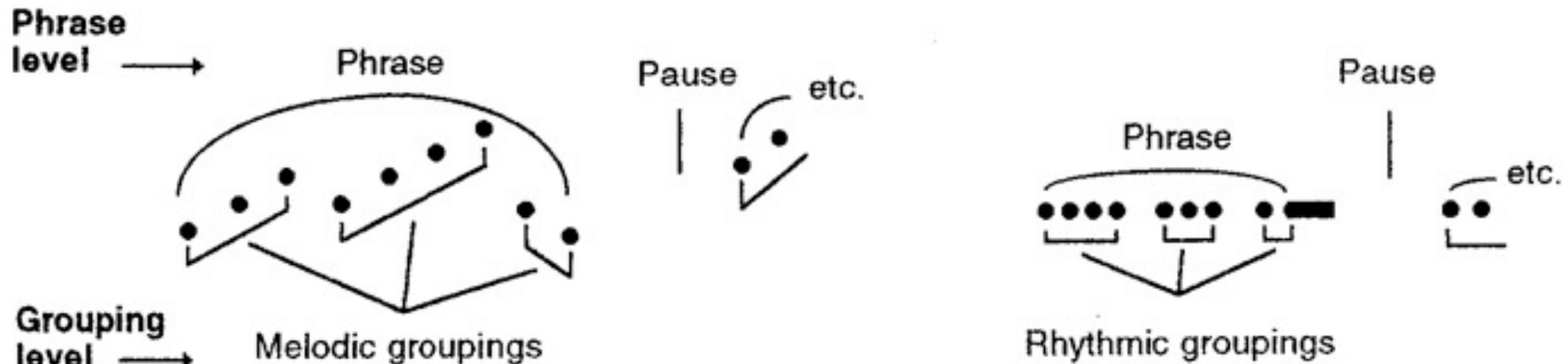


Figure 3.3  
Melodic and rhythmic grouping.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000. Courtesy of MIT Press.  
Used with permission.

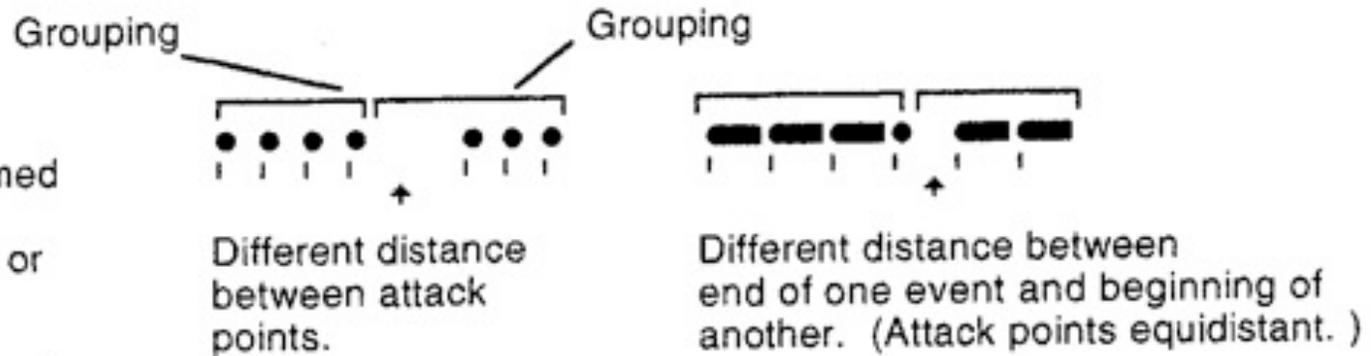
# Temporal grouping

(Snyder, Music & Memory)

40 Chapter 3. Grouping

## PROXIMITY

Proximity effect:  
a boundary is formed  
by a different  
*distance between* or  
*length of event*.  
(Arrows indicate  
point of realization of  
change.)



---

## SIMILARITY

Similarity effect:  
a boundary is formed  
by a change in the  
*consistency* of events.  
(Arrows indicate point  
of realization of  
change.)

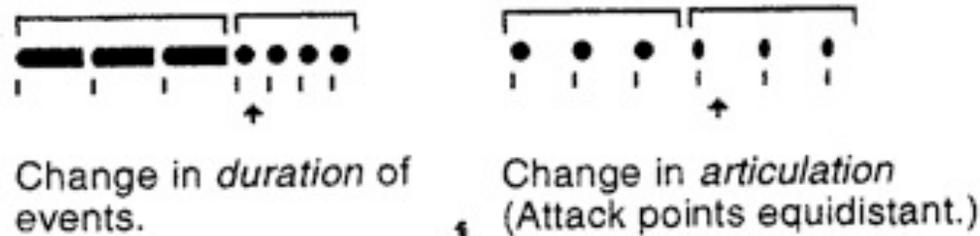


Figure 3.4  
Temporal grouping.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000.  
Courtesy of MIT Press. Used with permission.

# Repetition of a rhythmic pattern establishes the pattern

Image removed due to copyright restrictions.

- a) Two measure rhythmic pattern.
- b) Complete 2-bar pattern, followed by a repetition of the complete pattern.
- c) Complete 2-bar pattern, followed by two repetitions of the 2nd measure.
- d) Complete 2-bar pattern, followed by two repetitions of the 2nd measure in reverse.
- e) Complete 2-bar pattern; unique 3rd measure, and then a repetition of the 2nd measure.

# Necklace notation: cyclical repeating patterns

Fig. 2.6 in Sethares, W. A. *Rhythm and Transforms*.  
Springer, 2007. ISBN: 9781846286391.  
Preview in [Google Books](#).

# Necklace notation: cyclical repeating patterns

Fig. 2.4 in Sethares, W. A. *Rhythm and Transforms*. Springer, 2007. ISBN: 9781846286391. Preview in [Google Books](#).

see Sethares, 2007. Necklace notation: Safi al-Din al-Urmawi 13th c. Bagdad *Book of Cycles*

Thursday, May 14, 2009

# Necklace notation: cyclical repeating patterns

Fig. 2.5 in Sethares, W. A. *Rhythm and Transforms*. Springer, 2007. ISBN: 9781846286391.  
Preview in [Google Books](#).

# **Memory processes generate musical context**

**Tonality induction -- repetition of particular notes & sets of harmonics that establishes a tonal expectation through which all subsequent incoming tonal patterns are processed -- establishment of the tonic**

**Rhythmic induction -- repetition of patterns of accented and unaccented events that establishes a temporal pattern of expectation for subsequent events**

**Both kinds of induction operate on similarities and contrasts between previous and subsequent sounds & events**

**OLD + NEW heuristic:**

- 1) OLD incoming patterns similar to previous ones build up the images of previous ones, confirm + strengthen expectations, create relaxation**
- 2) NEW different patterns create contrasts that violate expectations established from previous inputs, create tension**
- 3) degree of contrast (distance in perceptual space) determines the degree of tension created/resolved**

# Hierarchy & time order (Snyder, Music & Memory, MIT Press, 2000)

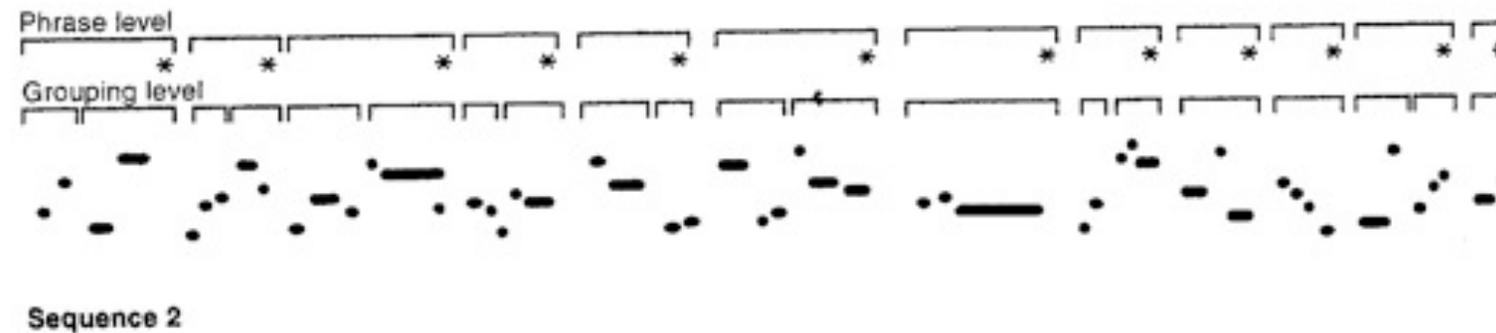
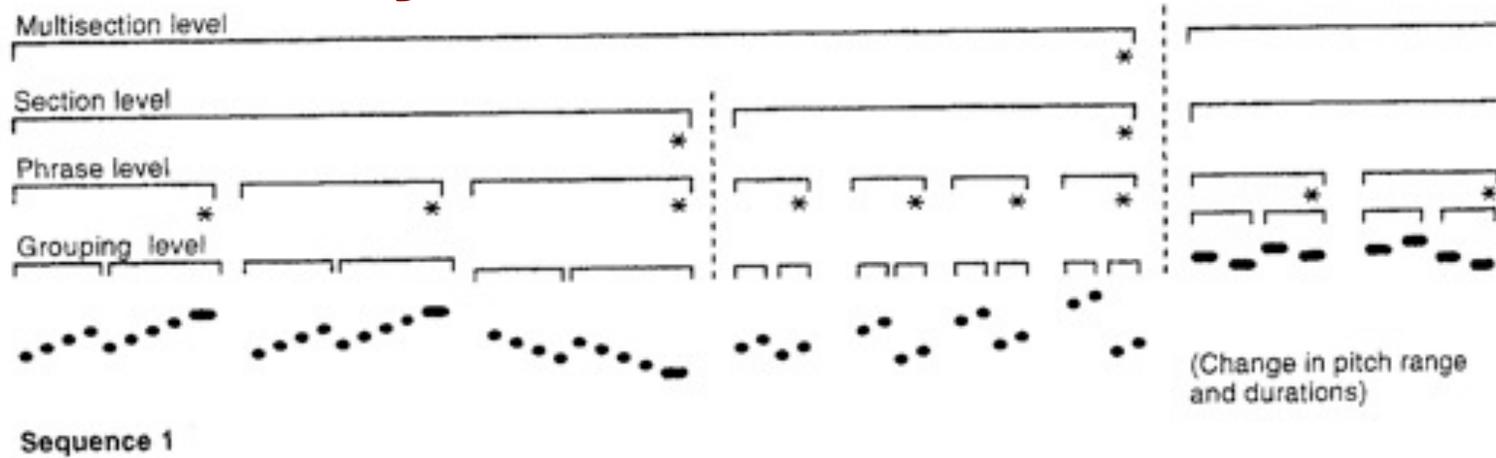
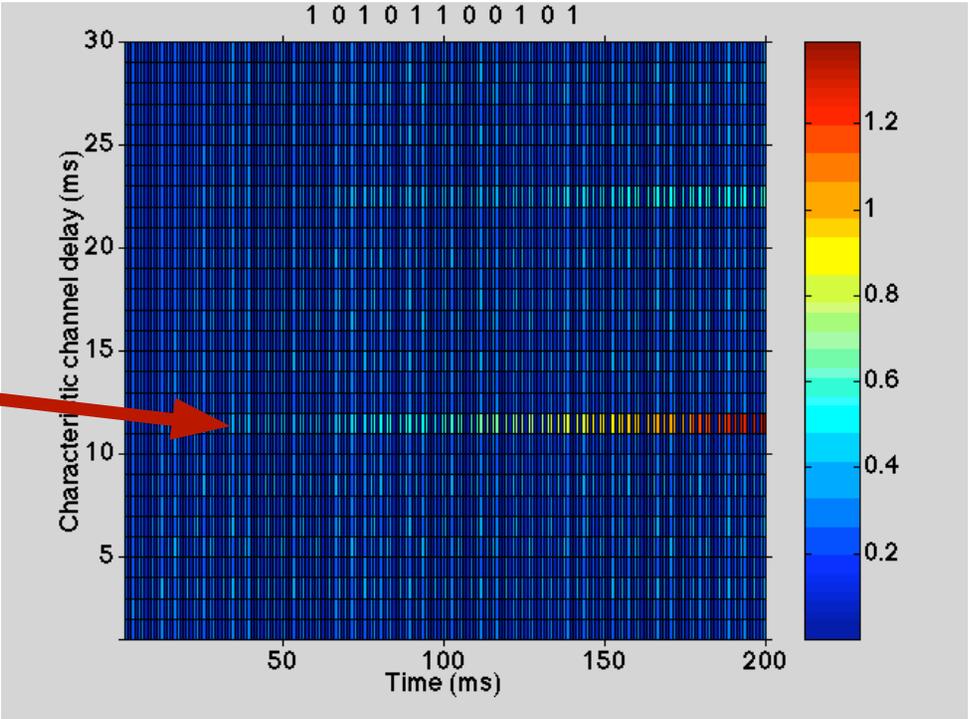
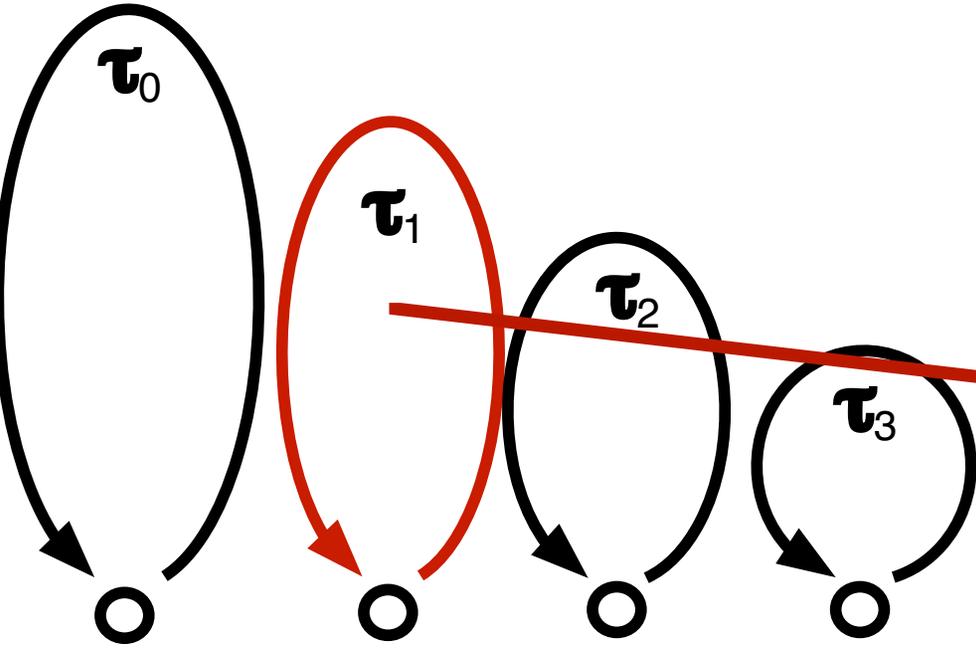


Figure 13.2  
Hierarchy and time order. These diagrams represent a highly simplified representation of two ways of structuring time-ordered sequences of musical events. Both sequences have the same number of events. Complete chunks at various levels are represented by horizontal brackets; higher-level chunking boundaries, by dashed vertical lines; and cues, by asterisks.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000.  
Courtesy of MIT Press. Used with permission.

# Detection of arbitrary periodic patterns

Periodic patterns invariably build up in delay loops whose recurrence times equals the period of the pattern and its multiples.



$\tau_1 = 11 \text{ ms} =$  recurrence time of input pattern `10101100101`

**Input pattern**

`1010110010110101100101101011001011010...`

# Temporal coding of rhythm

## Stimulus-driven temporal patterns of spikes encode event structures

- Exist at the cortical level for periodicities < 15 Hz
- Can directly encode rhythmic patterns
- Amenable to processing via recurrent timing nets (RTNs)
- Chunk recurrent patterns of events to create rhythmic expectancies

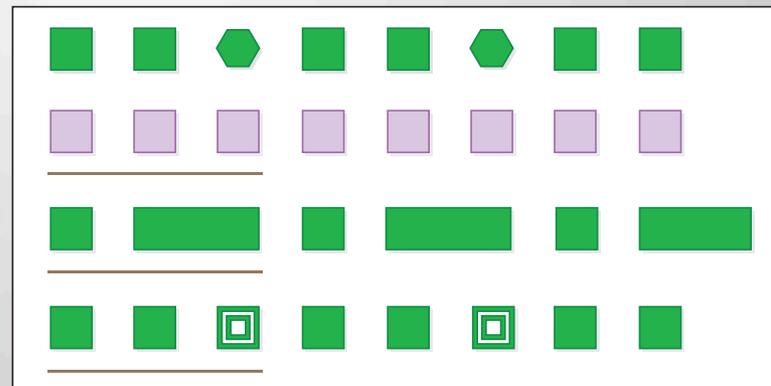
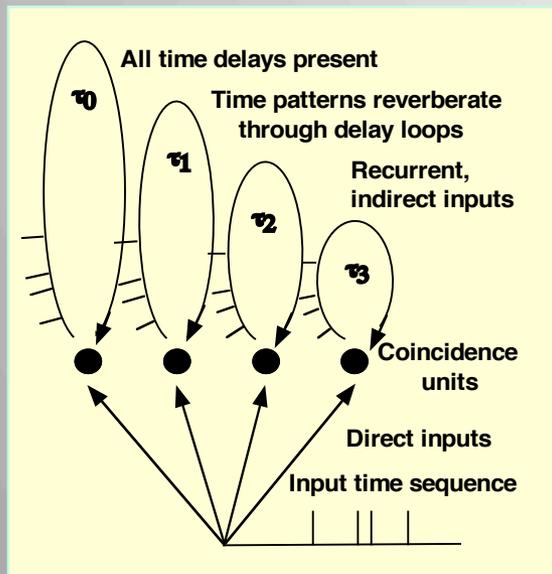


Figure by MIT OpenCourseWare.

$\Delta$  quality

no  $\Delta$

$\Delta$  pitch

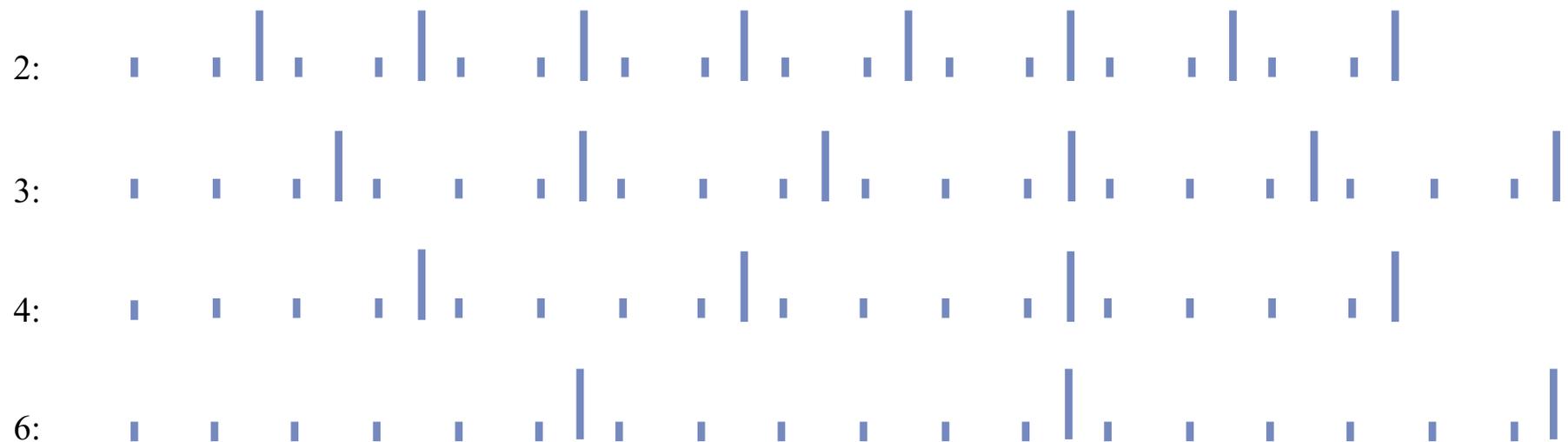
$\Delta$  timbre

$\Delta$  duration

**In addition to rhythmic patterning,  
we seem to infer an underlying metrical  
grid to the stream of events  
(e.g. inferences that allow us to tap our  
fingers or toes to a beat or to keep time  
with the music)**

**This perception of an underlying metrical  
order is important for coordination of  
musicians playing in groups.**

**Meter serves as a temporal context that is  
somewhat independent of individual events  
(somewhat like the tonic vis-a-vis melody)**



## Meter and Accent

The recurrent groups of pulsations are called *meters*: for example, duple meter, triple meter, and quadruple meter. The beats within the measures are counted and accented:

2: one, two | one, two |

3: one, two, three | one, two, three |

4: one, two, three, four | one, two, three, four |

6: one, two, three, four, five, six |

Figure by MIT OpenCourseWare.

# Meter (e.g. 4 pulses per measure, accent)

**Definition:** The number of pulses between the more or less regularly recurring accents

(Cooper and Meyer , 1960).

Most authors define meter similarly, as somehow dependent upon (and perhaps contributing to) patterns of accent.

Zuckerkandl (1956), however, views meter as a series of "waves" that carry the listener continuously from one beat to the next. For him, they result not from accentual patterns but simply and naturally from the constant demarcation of equal time intervals.

# Pulse & the metrical grid (meter)

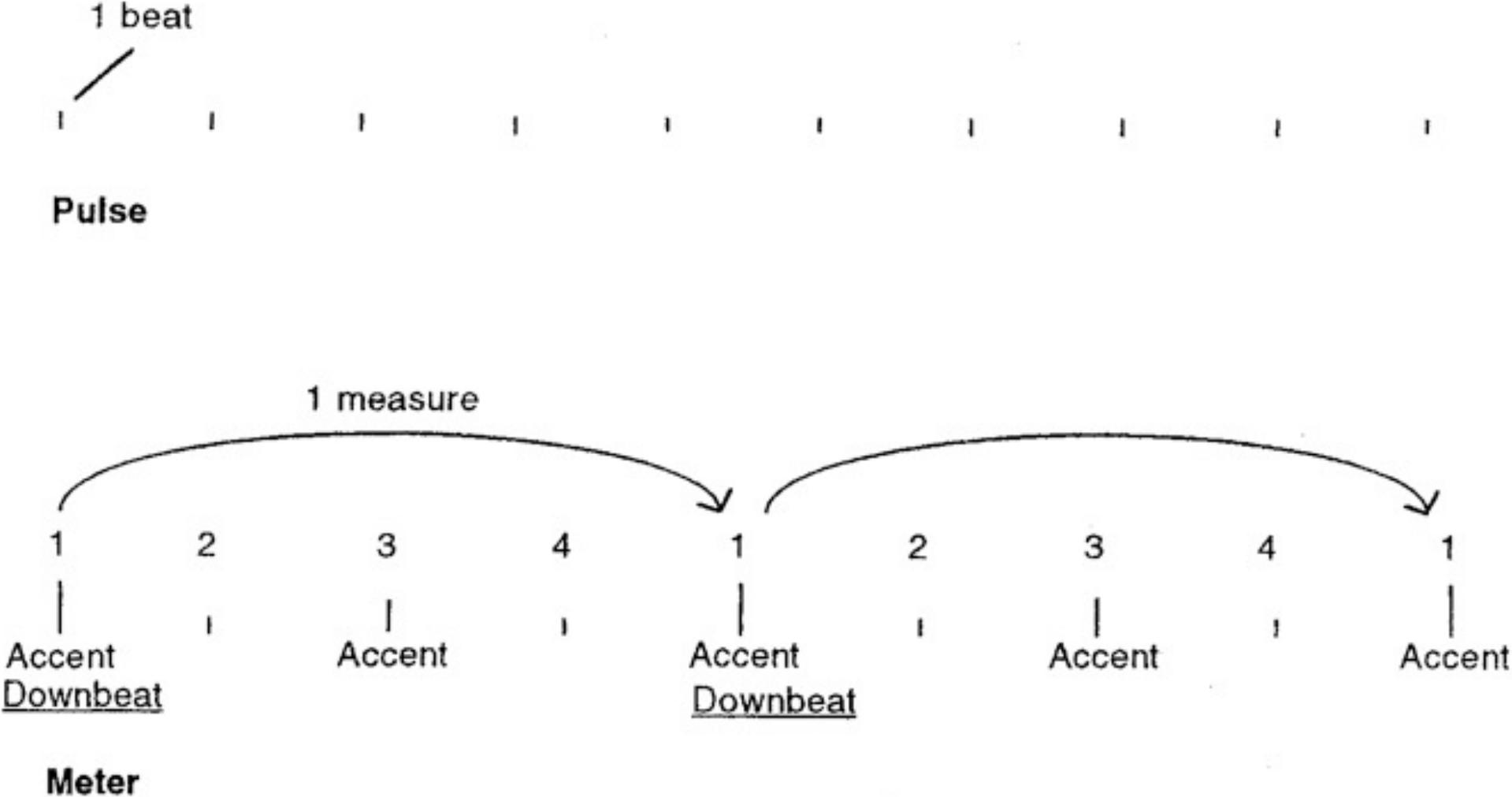


Figure 12.5  
Pulse and meter.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000. Courtesy of MIT Press.  
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# Pulse

- **Definition:** A series of regularly recurring, precisely equivalent stimuli ( Cooper and Meyer , 1960).
- According to Parncutt (1987), a chain of events, roughly equally spaced in time.

# Visual grouping

Dember & Bagwell, 1985, A history of perception, Topics in the History of Psychology, Kimble & Schlesinger, eds.

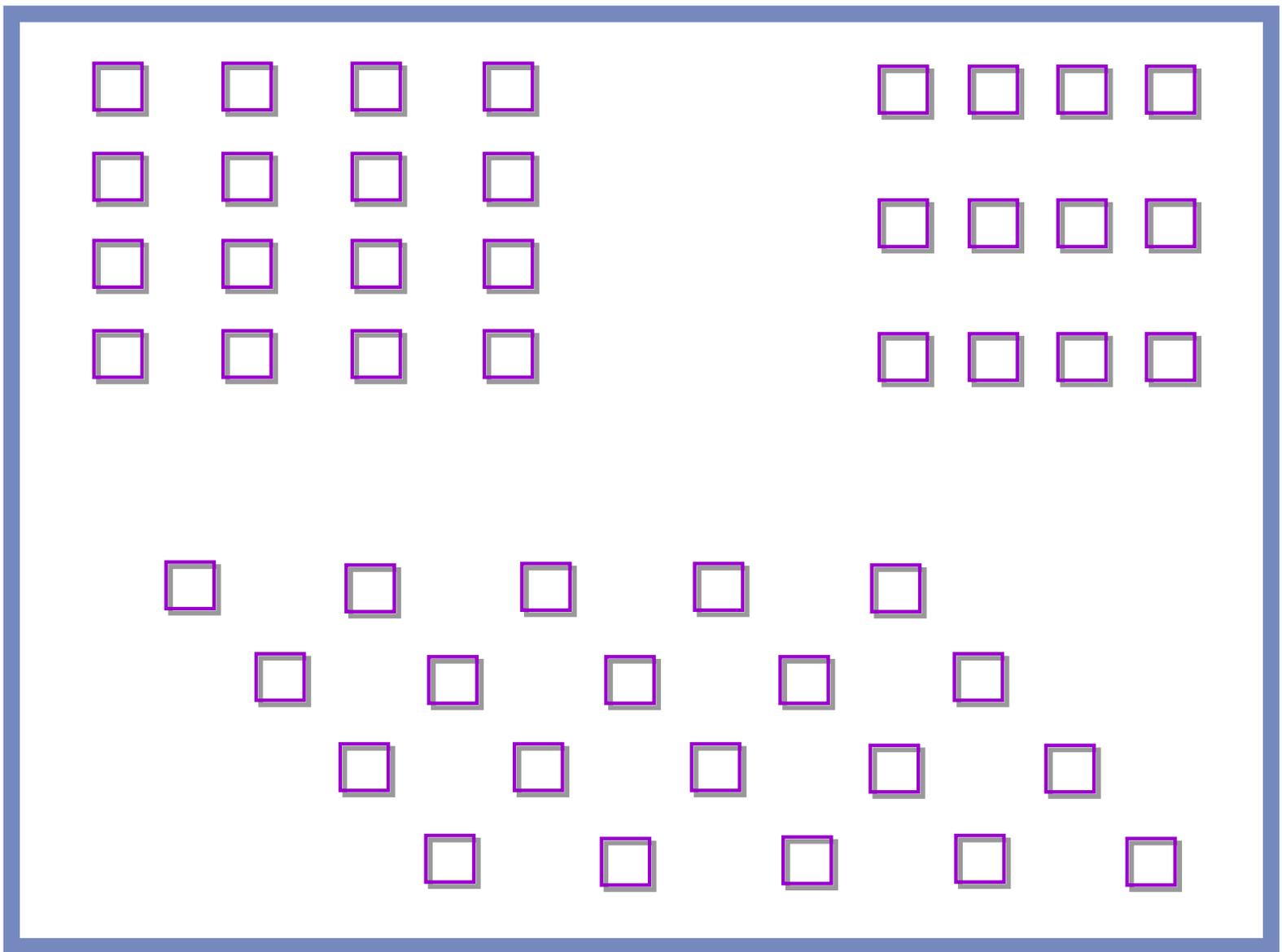


Figure by MIT OpenCourseWare.

**Accent causes grouping which determines perceived rhythmic pattern**

**Rhythm is a perceptual attribute**

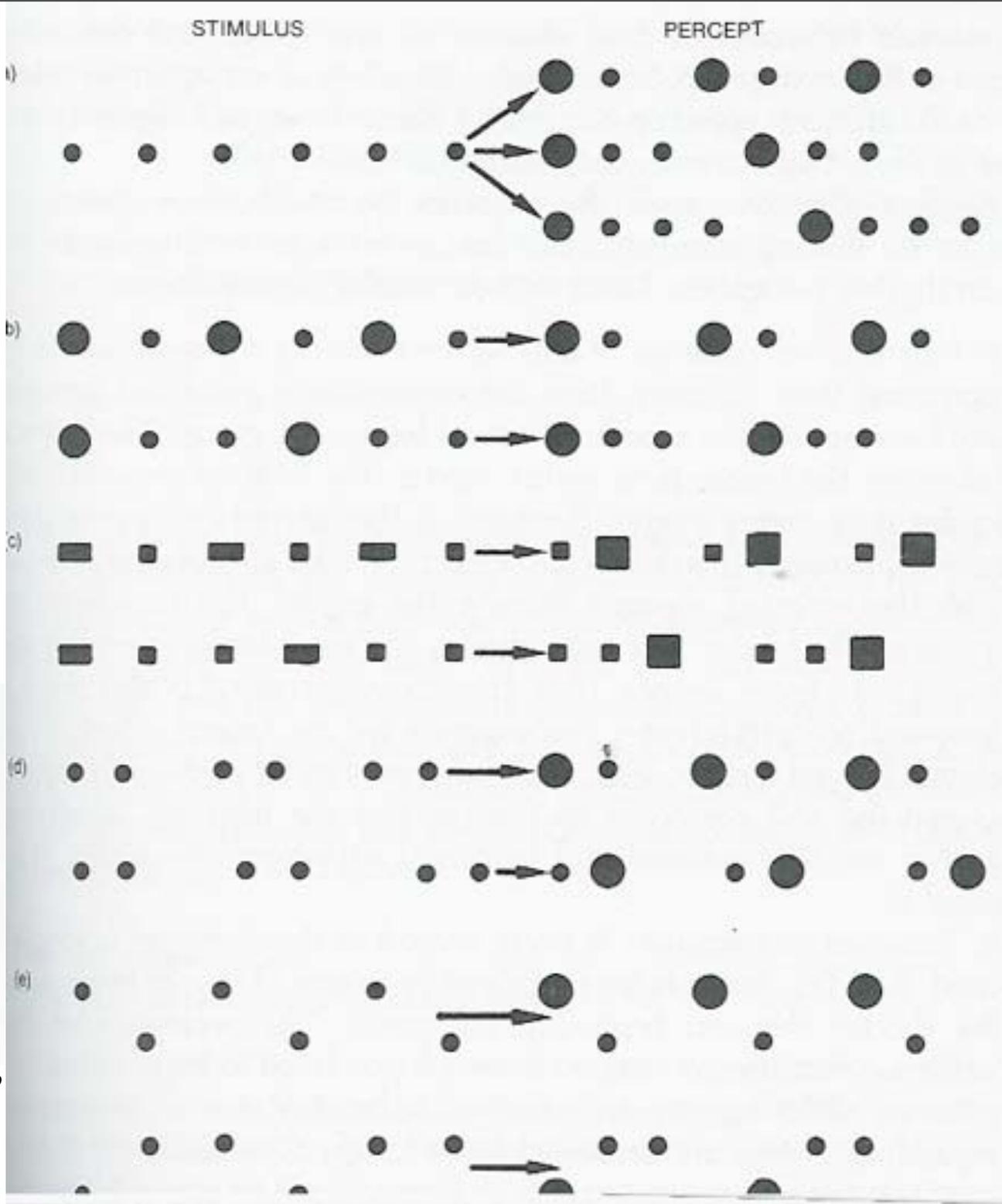


Figure 11.1

"Additive" rhythm. A series of equally timed elements (i.e., equal temporal intervals between the onset of successive identical elements) is perceived as rhythmical. A series of identical elements, as in (a), is perceived to form groups of 2, 3, or 4 elements. The initial onset of each group is perceived to be accented (represented by a bigger filled circle), and the time intervals between elements do not appear equal. If every second or third element is more intense, as in (b), the elements are perceived to form groups so that the more intense elements begin each group and there appear to be longer intervals between groups. If every second or third element is longer, as in (c), the elements are perceived to form groups so that the longer duration elements are the last elements of each group, the longer duration elements appear accented, and there appear to be longer intervals between groups. If every second interval between two elements is increased so that the elements form groups temporally, as in (d), then the first elements of each group appears accented if the longer interval is slightly greater than the other intervals, but the last element of each group appears accented if the longer interval is much greater than the other interval. If the elements are different frequencies, as in (e), then the elements are perceived to form groups so that the higher-pitch element begins each group and appears accented, and the interval between groups appears longer. If one note occurs less often, it may appear to be accented although each group.

Source: Handel, S. *Listening: An Introduction to the Perception of Auditory Events*. Cambridge, MA: MIT Press, 1989.

Courtesy of MIT Press. Used with permission.

# Factors that cause events to be accented: auditory contrast, salience

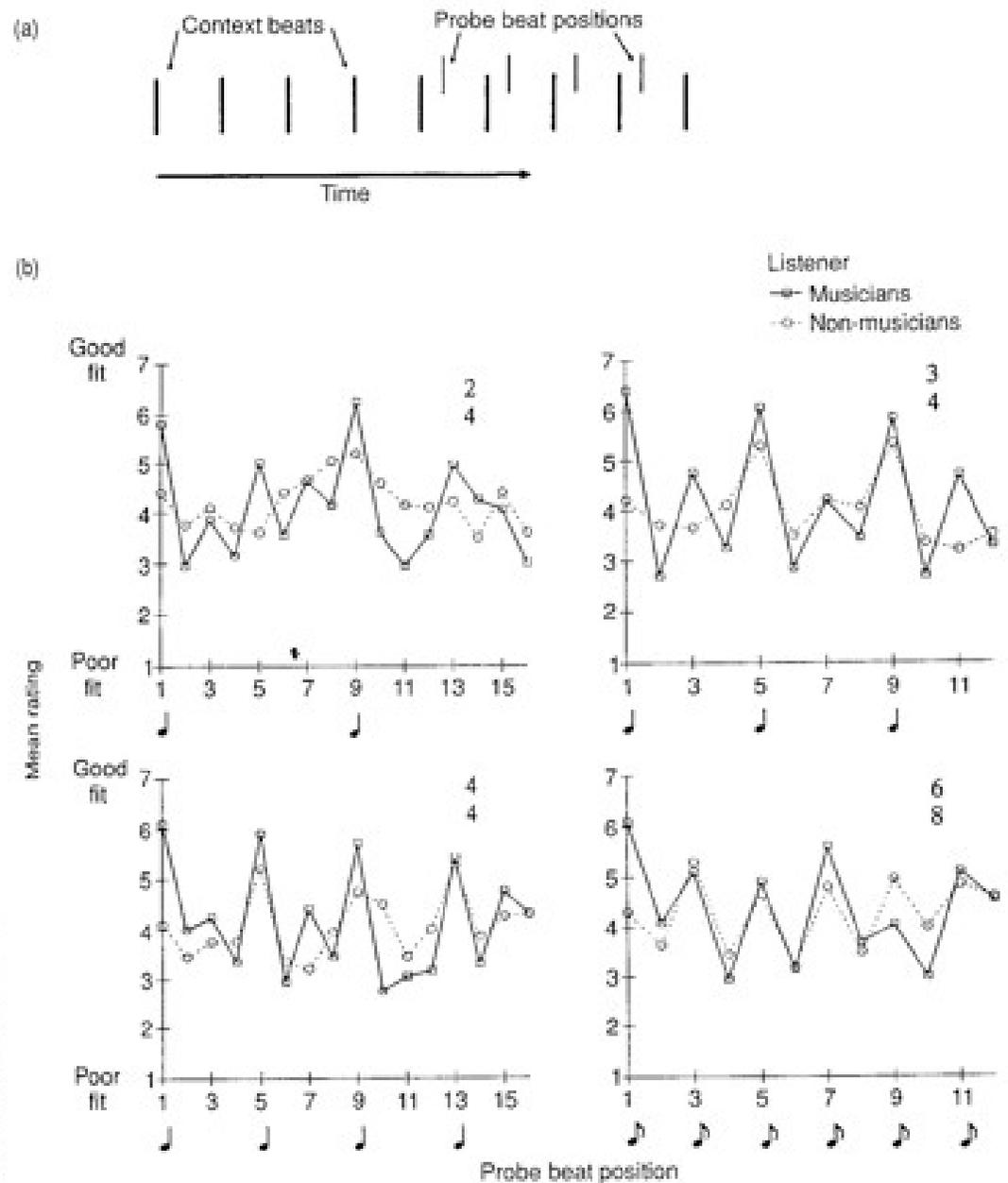
- note duration
- note intensity
- sharpness of attack
- duration of silence preceding it
- contrast: melodic contour/ pitch change
- regularity of timing (accented beats are "on time")
- position within a metrical organization
- According to Cooper & Meyer (1960), an accented tone must be set off from the rest of the series in some way (i.e. a salient contrast)

# Expressive timing & expectation

## expressive timing Definition:

Music psychologists' term for the deviations from a strictly uniform pulse that occur in live performance. These deviations most commonly occur near the ends of phrases and other grouping units. See [Todd \(1985\)](#).

# Meter and beat induction



Source: Palmer, C., and C. L. Krumhansl.

"Mental representations for musical meter."

*J Exp Psychol Hum Percept Perform* 16, no. 4 (Nov 1990): 728-741.

Courtesy of the American Psychological Association.

- *From Thinking in Sound*

# rhythmic, metrical dissonance

- **metrical dissonance Definition:** According to Krebs (1987), a situation in which the pulses in two metrical levels are not well aligned, either because the duration of the pulses in one level is not an integral multiple or division of the duration of the pulses in the other level, or because the pulses in one level are displaced by some constant interval from those in the other level. See also Yeston's rhythmic dissonance .

# Event-related potentials & violations of temporal expectation

(notes, chords, beats, words (phonetic, semantic), many other levels of expectation)

Photo and graph of EEG/ERP removed due to copyright restrictions.

See: <http://www.musicianbrain.com/methods.php#methods>

Research report

# Gamma-band activity reflects the metric structure of rhythmic tone sequences

Joel S. Snyder<sup>a,T</sup>, Edward W. Large<sup>b</sup>

<sup>a</sup>Department of Psychology, Cornell University, Ithaca, NY 14853, USA

<sup>b</sup>Center for Complex Systems and Brain Sciences, Florida Atlantic University, Boca Raton, FL 33432, USA

Accepted 28 December 2004

Available online 17 February 2005

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## Abstract

Relatively little is known about the dynamics of auditory cortical rhythm processing using non-invasive methods, partly because resolving responses to events in patterns is difficult using long-latency auditory neuroelectric responses. We studied the relationship between short-latency gamma-band (20–60 Hz) activity (GBA) and the structure of rhythmic tone sequences. We show that induced (non-phase-locked) GBA predicts tone onsets and persists when expected tones are omitted. Evoked (phase-locked) GBA occurs in response to tone onsets with ~50 ms latency, and is strongly diminished during tone omissions. These properties of auditory GBA correspond with perception of meter in acoustic sequences and provide evidence for the dynamic allocation of attention to temporally structured auditory sequences.

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Theme: Neural basis of behavior

Topic: Cognition

Keywords: Electroencephalography; Gamma-band activity; Rhythm perception; Music; Speech

# Snyder & Large experiments on beat induction

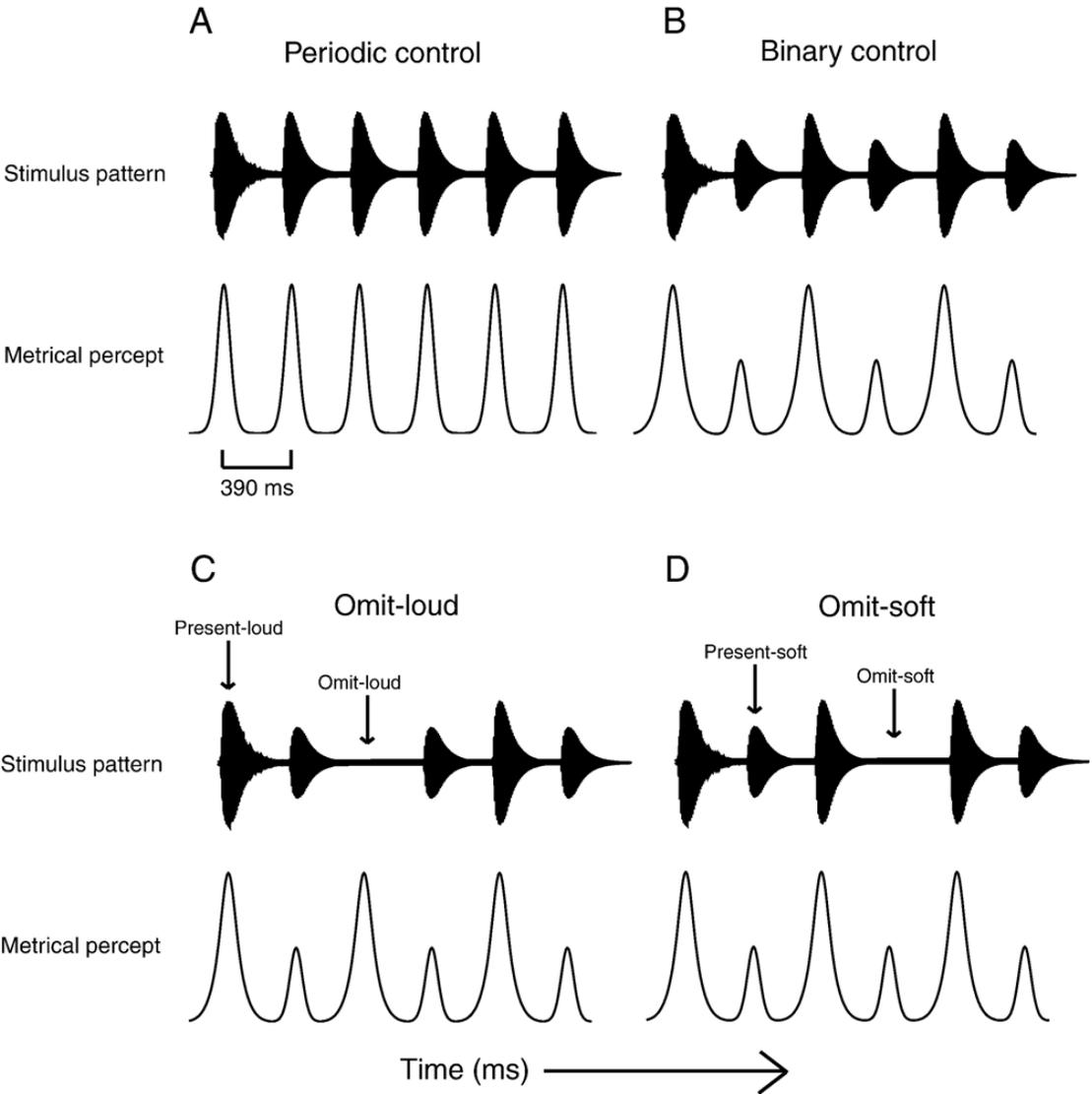
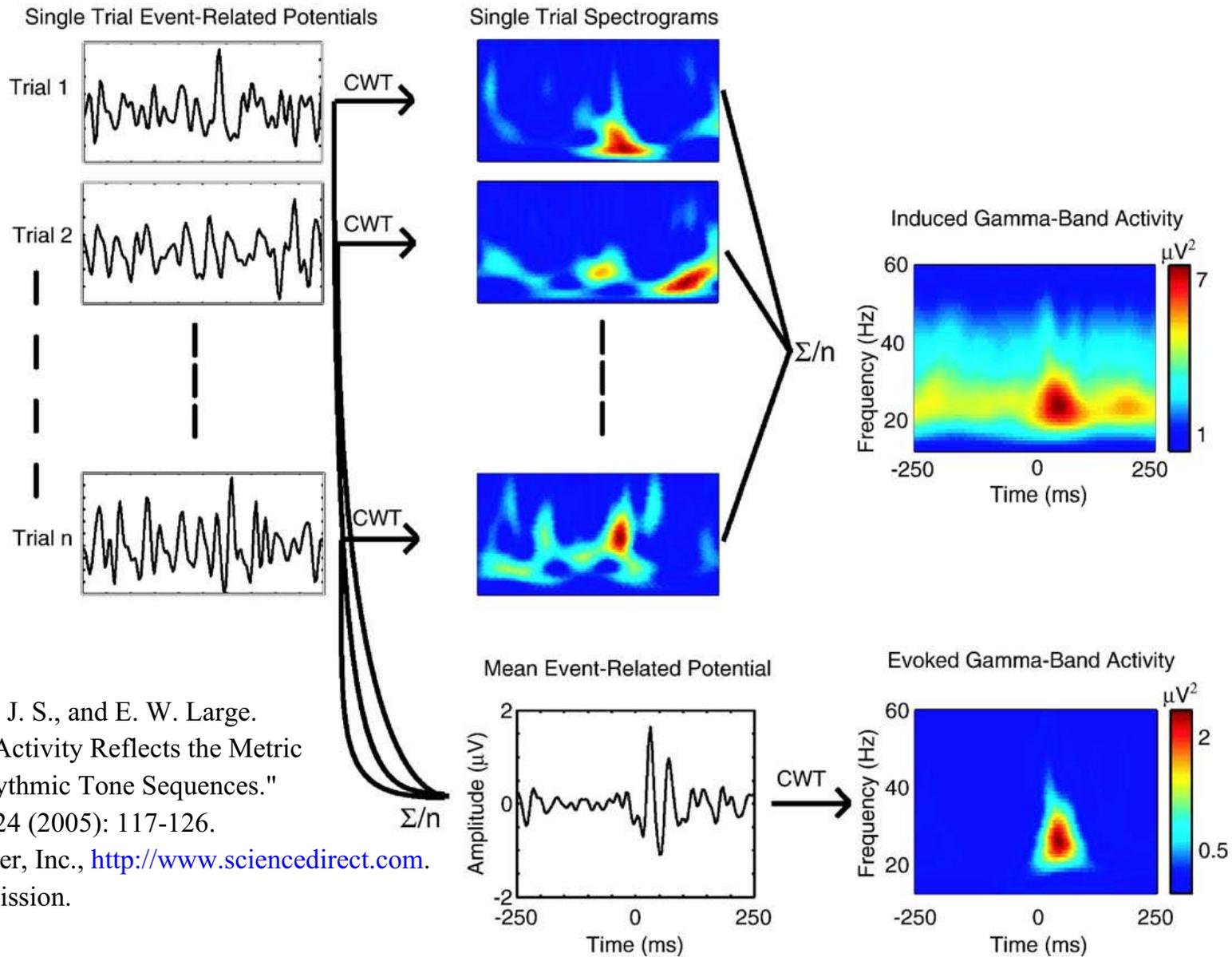


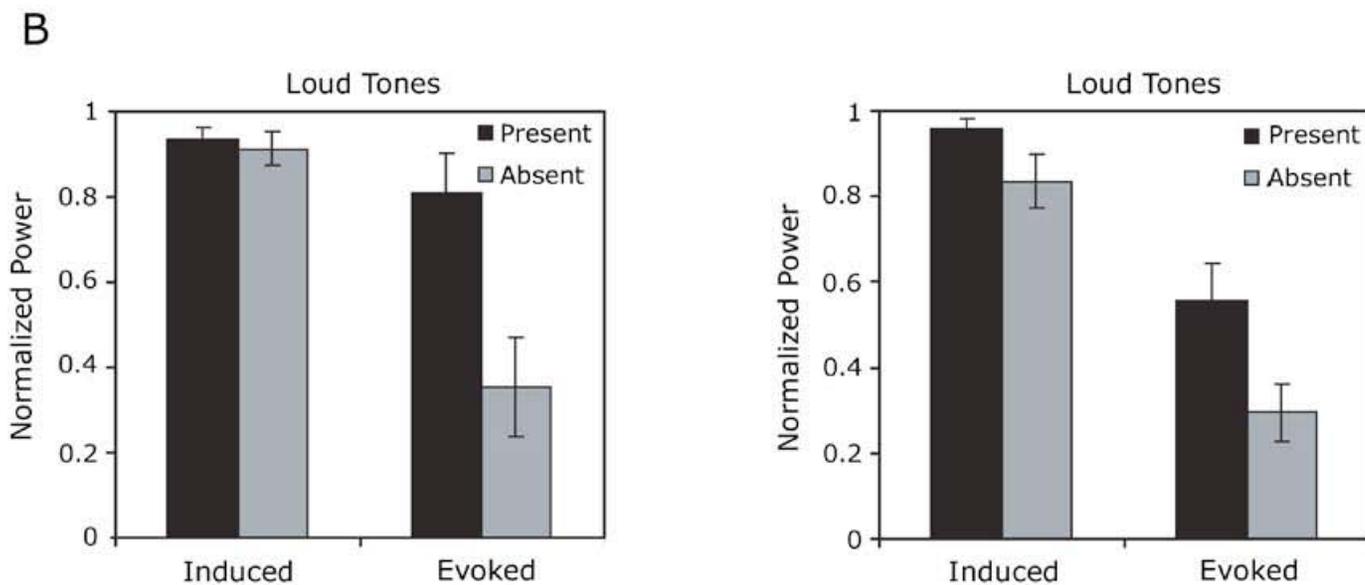
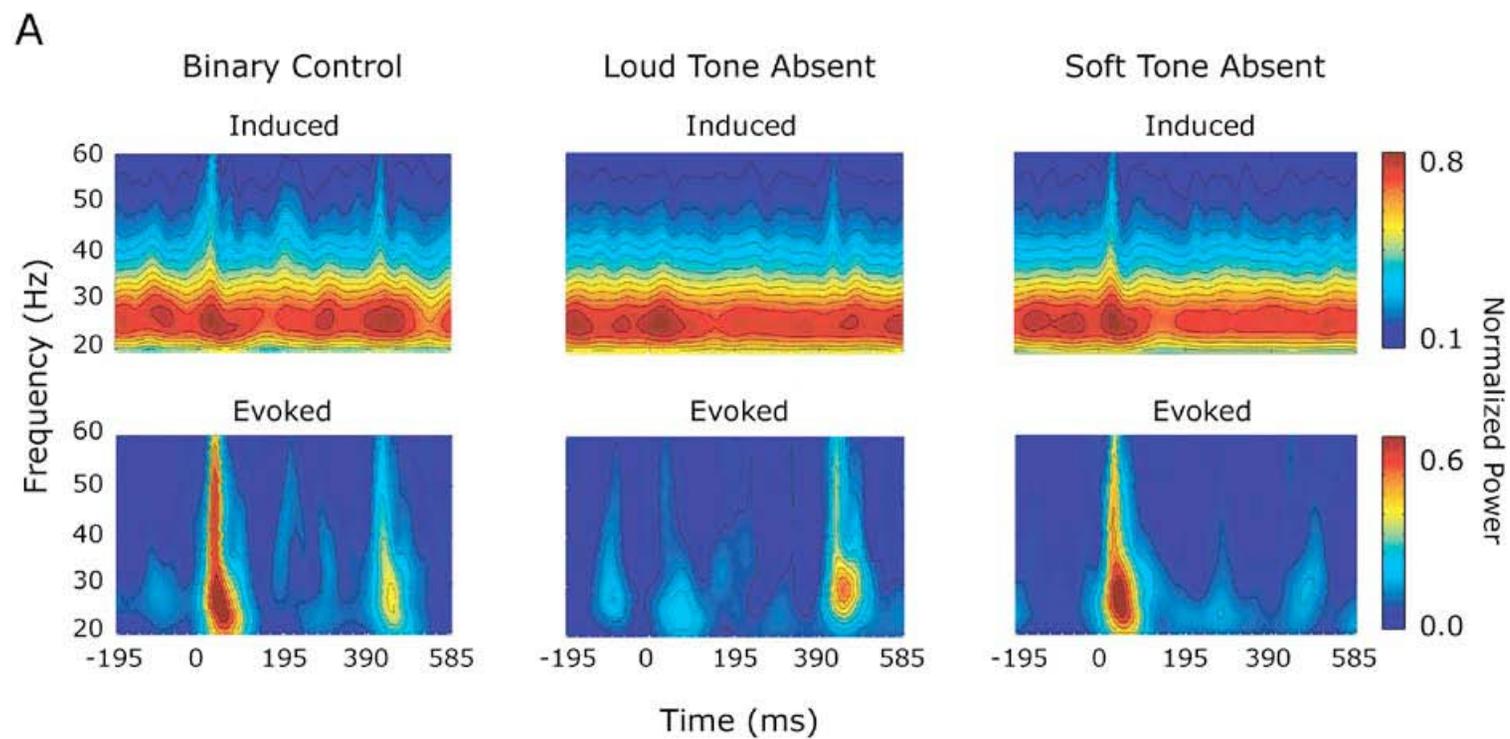
Fig. 1. Pure-tone (262 Hz, 50 ms duration) stimulus patterns are shown with inter-onset intervals of 390 ms (above) and schematized metrical accent representations (below). The periodic control condition consisted of isochronous tones designed to elicit a simple pulse perception (A). The binary control condition consisted of alternating loud and soft tones, designed to elicit a duple meter perception (B). The omit-loud condition consisted of the binary control pattern with missing loud tones on 30% of two-tone cycles (C). The omit-soft condition consisted of the binary control pattern with missing soft tones on 30% of two-tone cycles (D).

Source: Snyder, J. S., and E. W. Large. "Gamma-band Activity Reflects the Metric Structure of Rhythmic Tone Sequences." *Cog Brain Res* 24 (2005): 117-126.

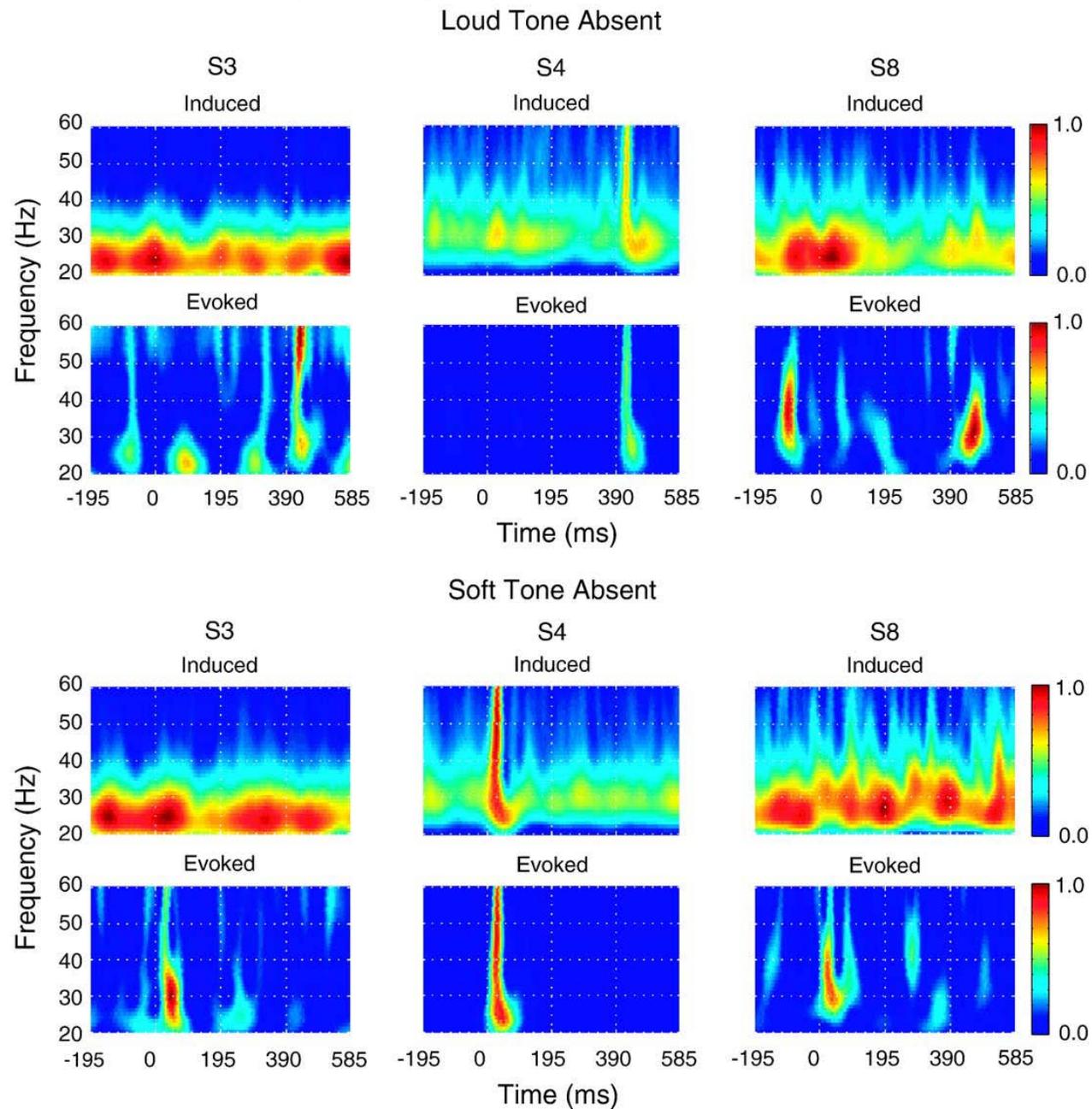


Source: Snyder, J. S., and E. W. Large.  
 "Gamma-band Activity Reflects the Metric  
 Structure of Rhythmic Tone Sequences."  
*Cog Brain Res* 24 (2005): 117-126.  
 Courtesy Elsevier, Inc., <http://www.sciencedirect.com>.  
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Figure 2. Process to calculate evoked and gamma-band activity (GBA).

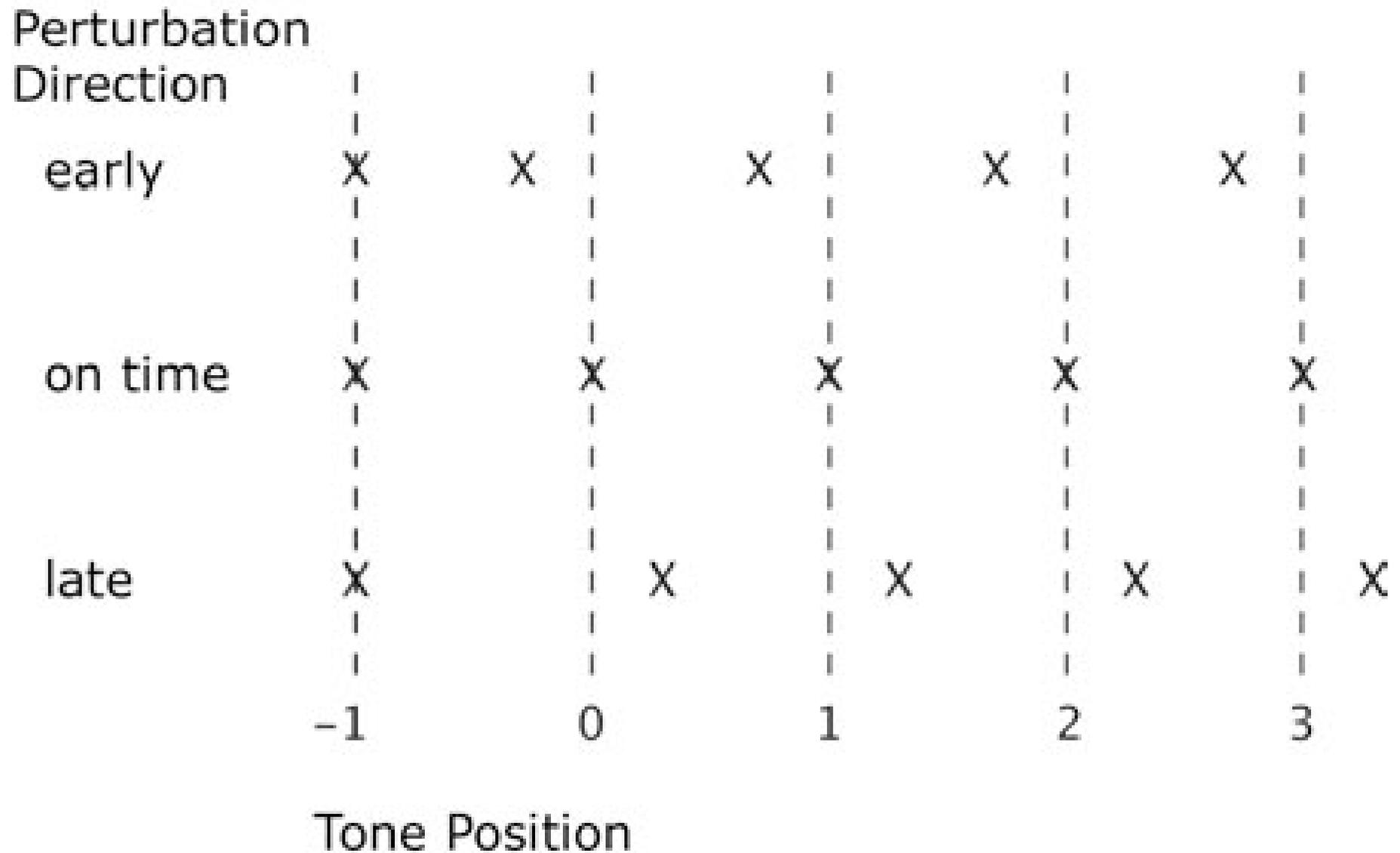


**Figure 4.** Courtesy of University of Finance and Management, Warsaw. Used with permission.  
 (a) Time-frequency representation of the evoked and induced GBA results, averaged over all subjects. Tone onset occurs at zero and 390 ms. (b) Comparison of induced/evoked peak activity in the presence and absence of loud and soft tones.



Source: Snyder, J. S., and E. W. Large. "Gamma-band Activity Reflects the Metric Structure of Rhythmic Tone Sequences." *Cog Brain Res* 24 (2005): 117-126.  
 Courtesy Elsevier, Inc., <http://www.sciencedirect.com>. Used with permission.

Figure 7. Tone omissions: induced and evoked GBA.

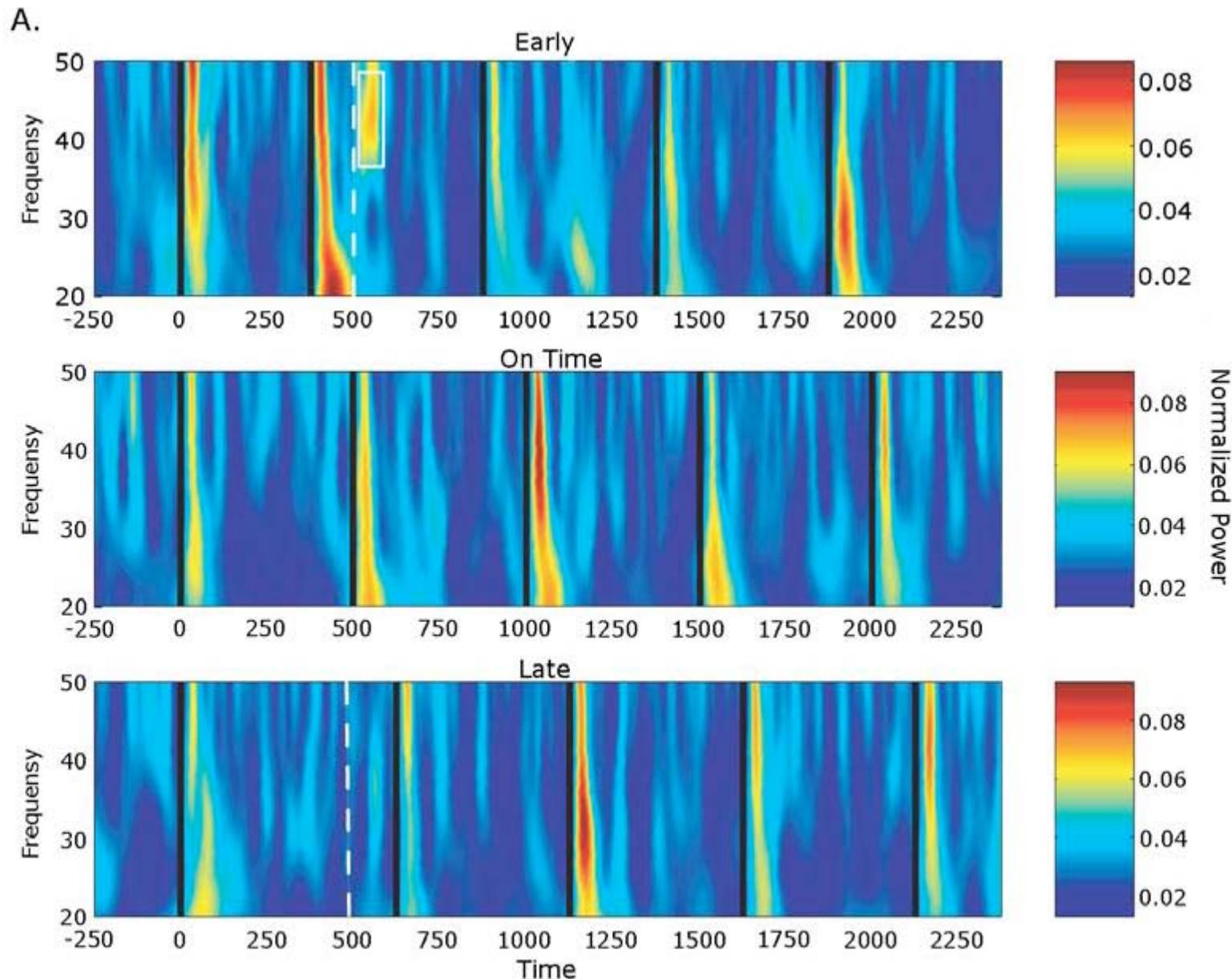


**Figure 5.**

*Perturbed stimuli; 'x' represents tone onset.*

Courtesy of University of Finance and Management, Warsaw. Used with permission.

# Evoked GBA

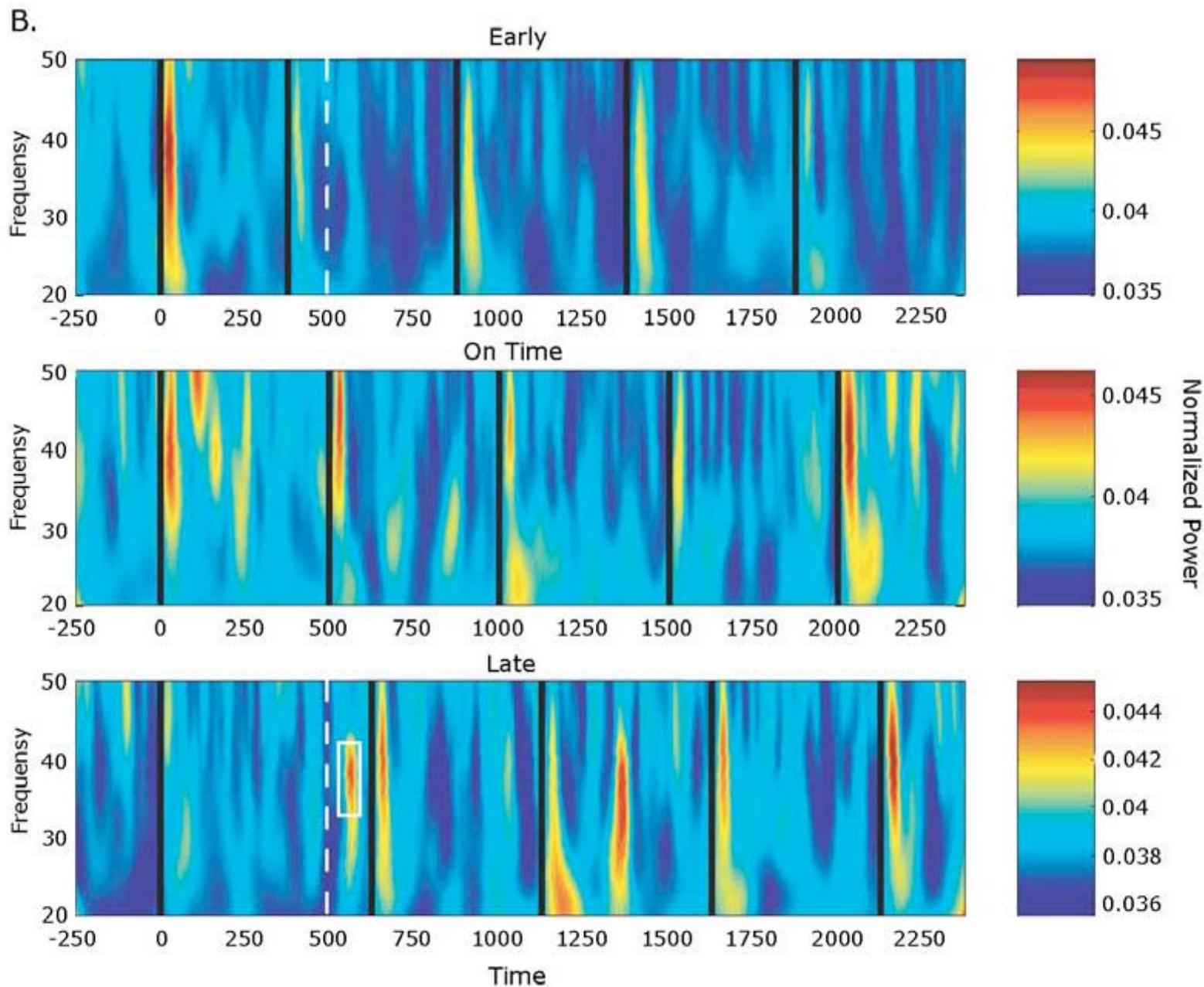


**Figure 6.**

Courtesy of University of Finance and Management, Warsaw. Used with permission.

*Time-frequency representation of the evoked and induced GBA in response to early, late, or on-time tones averaged over all subjects. The white dashed line represents where a tone was expected. (a) Evoked activity is predicted by the presence of tones. The white box highlights an exception, activity where the tone was expected in the case of an early tone. (b) The white box indicates a peak in the induced activity where the tone was expected for the case of late tones.*

# Induced GBA



**Figure 6.**

Courtesy of University of Finance and Management, Warsaw. Used with permission.

*Time-frequency representation of the evoked and induced GBA in response to early, late, or on-time tones averaged over all subjects. The white dashed line represents where a tone was expected. (a) Evoked activity is predicted by the presence of tones. The white box highlights an exception, activity where the tone was expected in the case of an early tone. (b) The white box indicates a peak in the induced activity where the tone was expected for the case of late tones.*

# SUMMARY

Evoked GBA appears to represent sensory processing as predicted by the presence of tones, much like the MLR. Induced GBA may reflect temporally precise expectancies for strongly and weakly accented events in

sound patterns. Moreover, induced GBA behaves in a manner consistent with perception-action coordination studies using perturbed temporal sequences. Taken together, the characteristics of induced GBA provide evidence for an active, dynamic system capable of making predictions (i.e., anticipation), encoding metrical patterns and recovering from unexpected stimuli.

GBA appears to be a useful neuroelectric correlate of rhythmic expectation and may therefore reflect pulse perception. Due to the anticipatory nature of GBA, it may be supposed there is an attentional dependence. Future research should aim to manipulate attentional state, localize neural sources and further probe the role of induced GBA in meter perception.

# Syncopation - violation of metrical expectations

Image removed due to copyright restrictions.

Definition of syncopation with some musical examples.

From Jones, G. T. *Music Theory*. New York, NY: Barnes and Noble Books, 1974.

## Rhythmic streaming (segregation/fusion of rhythmic

- African xylophone music
- Timbre effects
- Pitch difference
- Competition of frequency separations

# Rhythmic elaboration -subdividing time intervals

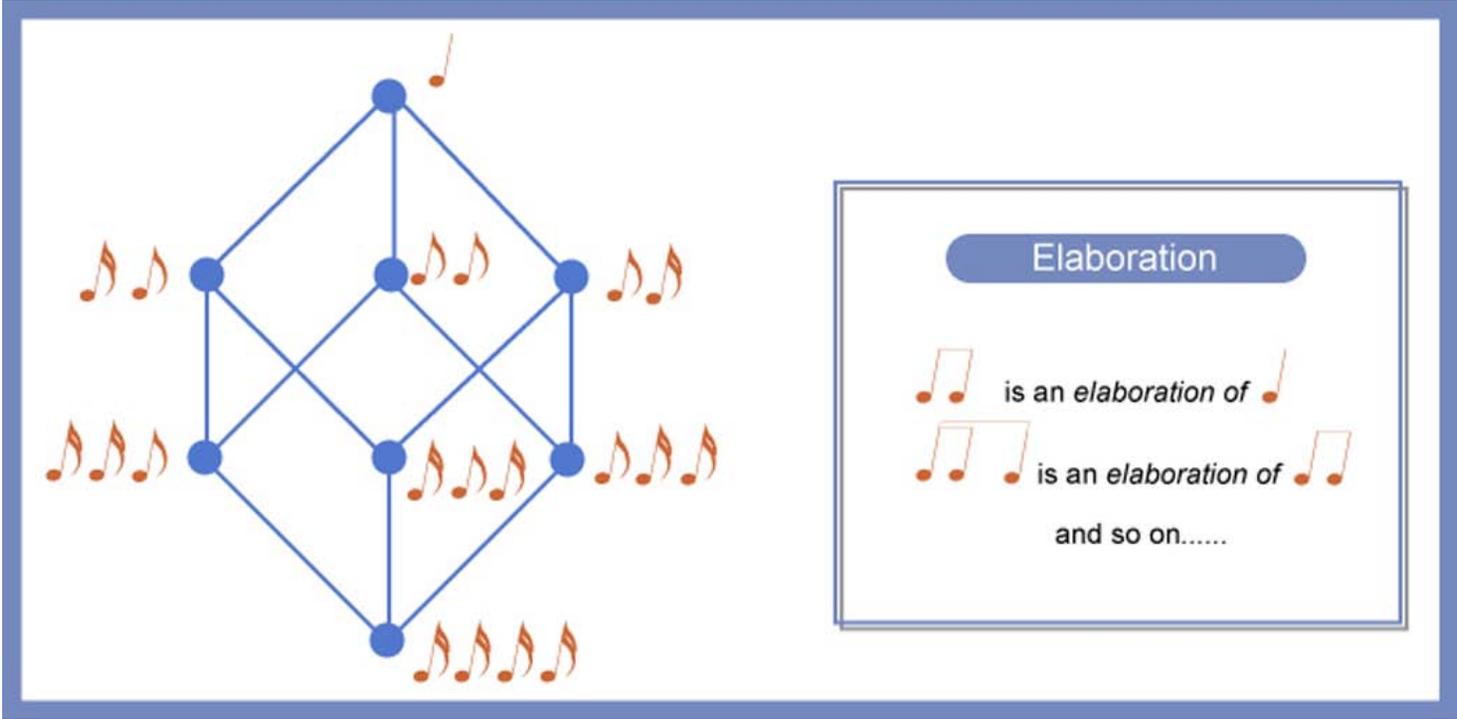
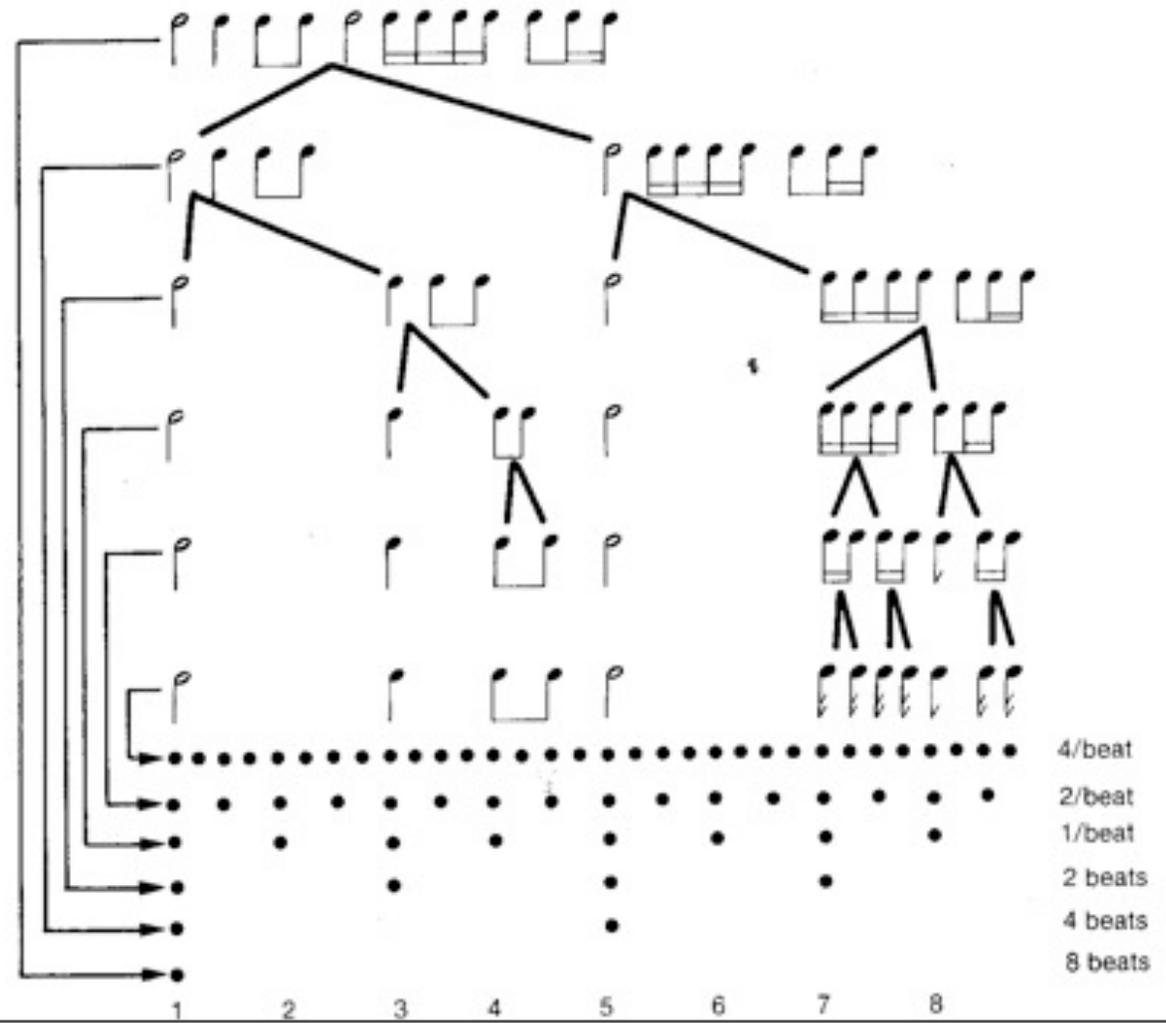
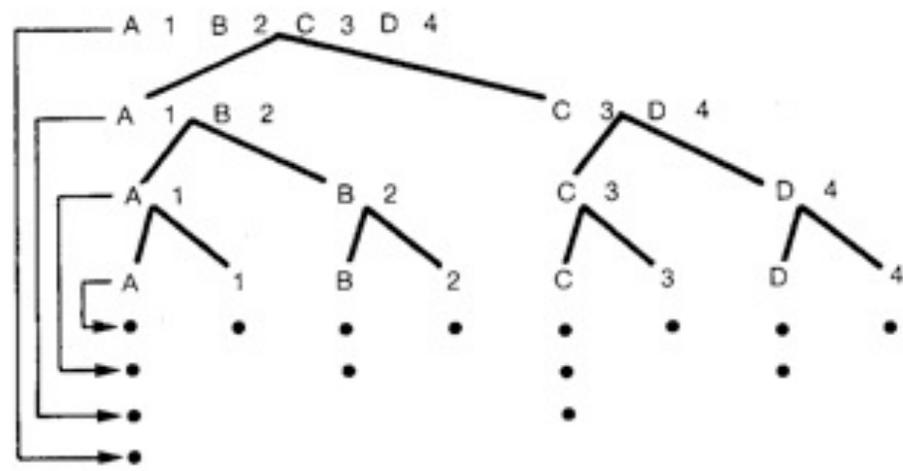


Figure by MIT OpenCourseWare.

Smulevitch & Povel (2000) in Rhythm: Perception & Production, Desain & Windsor eds

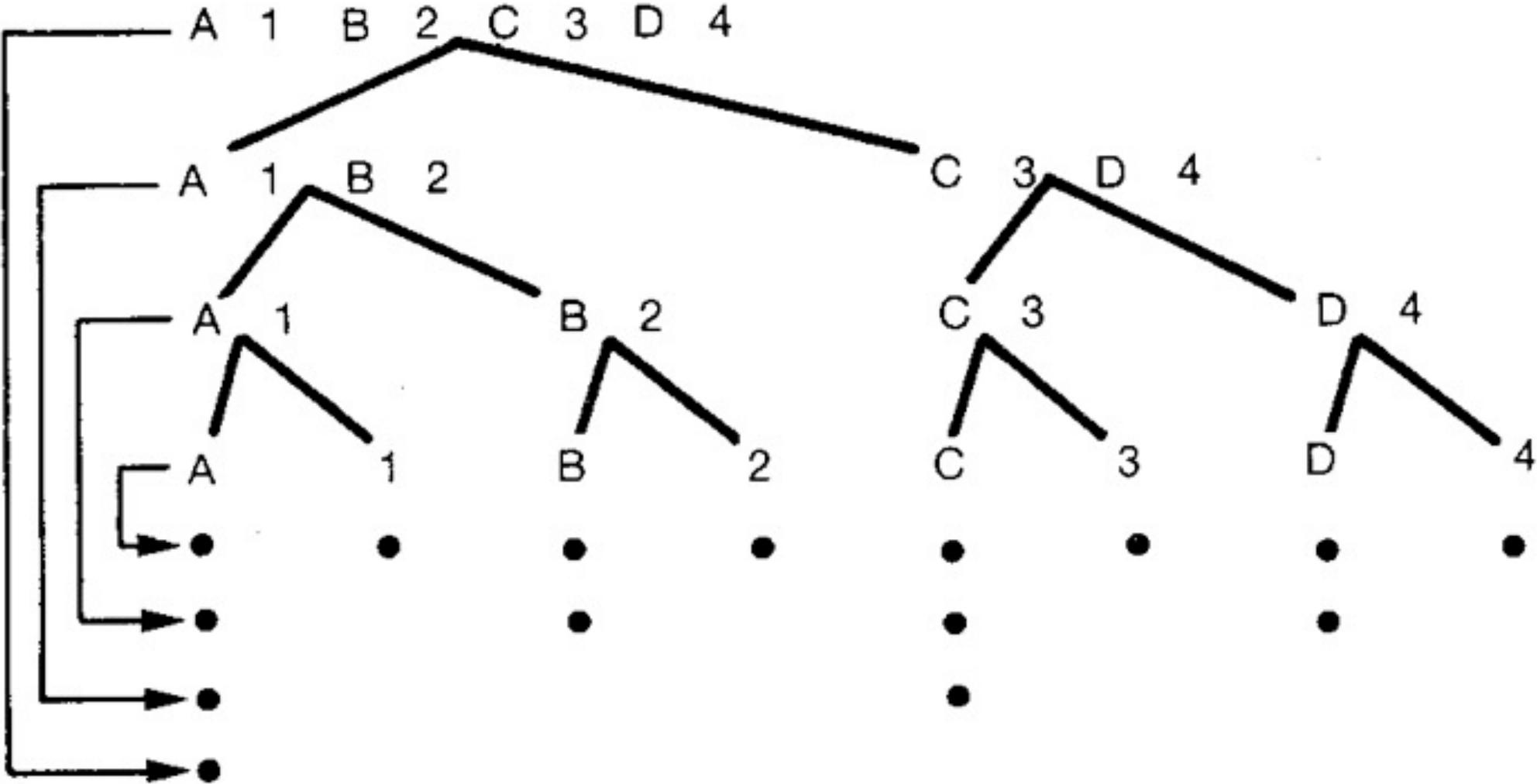
# Rhythmic Hierarchy



Source: Handel, S. *Listening: An Introduction to the Perception of Auditory Events*. Cambridge, MA: MIT Press, 1989.  
 Courtesy of MIT Press. Used with permission.

Handel

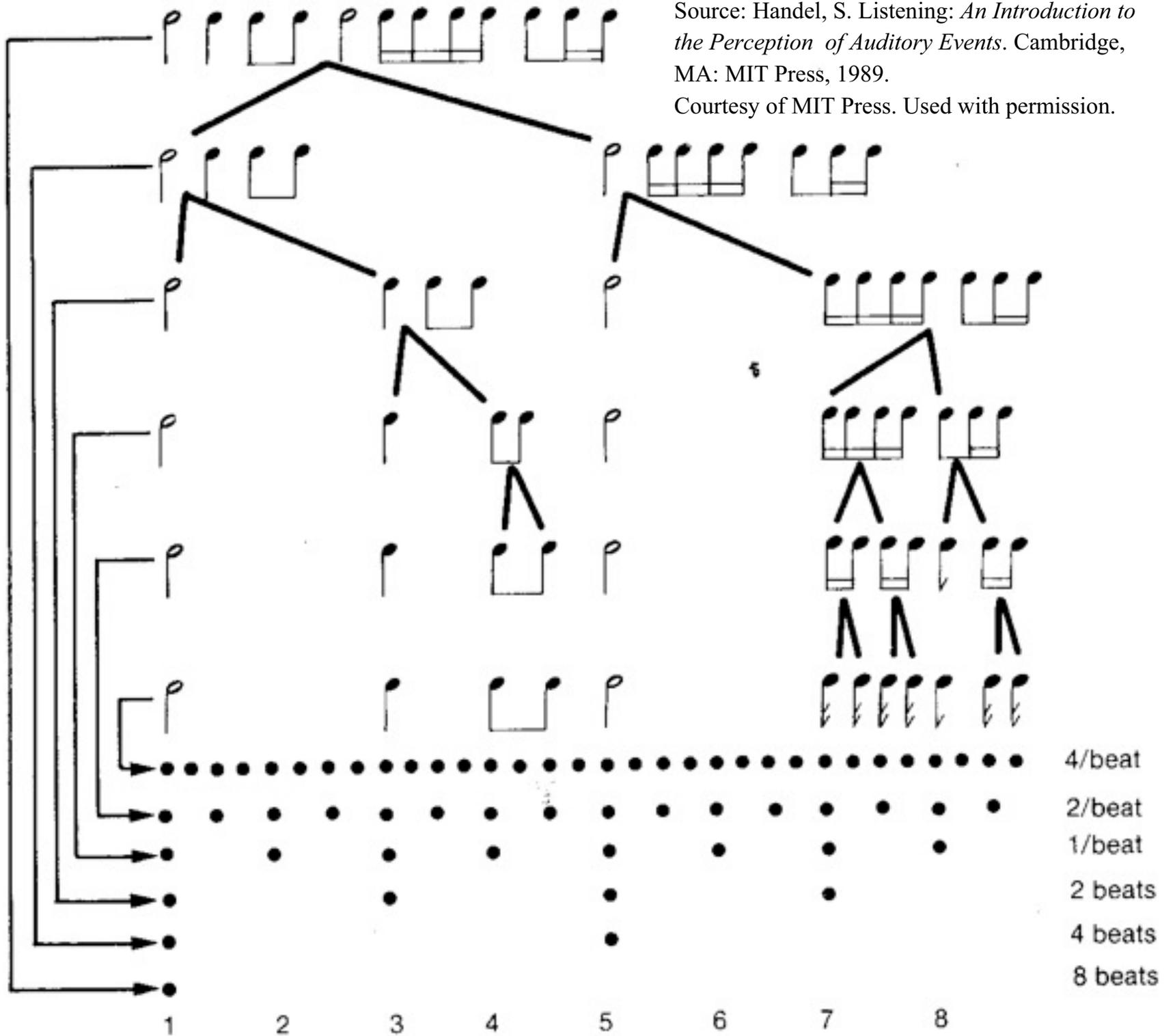
# Rhythmic Hierarchy



Source: Handel, S. *Listening: An Introduction to the Perception of Auditory Events*. Cambridge, MA: MIT Press, 1989.  
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Handel

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Handel

# Polyrhythms

PATTERN (LENGTH)	ELEMENTS																
	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17
ISOCHRONOUS PATTERNS																	
2(2)	X		X														
3(3)	X			X													
4(4)	X				X												
NON-ISOCHRONOUS																	
332(8)	X			X		X		X		X							
2223(9)	X		X		X		X		X		X						
22233(12)	X		X		X		X		X		X		X				
22323(12)	X		X		X		X		X		X		X				
23223(12)	X		X		X		X		X		X		X				
2223223(16)	X		X		X		X		X		X		X		X		X
33424(16)	X		X		X		X		X		X		X		X		X
POLYRHYTHMS																	
	Start	ELEMENTS											Repeat				
		1	2	3	4	5	6	7	8	9	10	11	12	13			
3 x 4		3				3				3				3			
		4			4			4			4			4			
ELEMENTS																	
		1				10				20				30			43
		2								2							2
2 x 3 x 7		3				3						3					3
		7		7		7		7		7		7		7		7	7
ELEMENTS																	
		1				18				36				54			71
		2								2							2
2 x 5 x 7		5				5				5				5			5
		7		7		7		7		7		7		7		7	7

Figure 11.5  
Rhythmic patterns that are used in the drum music of Africa. Typically several rhythmic lines are played simultaneously, and often a master drummer improvises on top of the repeating rhythmic patterns. Polyrhythms are defined as the simultaneous presentation of two isochronous patterns that do not share a common denominator. Three examples are shown. The element at which the polyrhythm repeats can be calculated by multiplying the number of elements in each line together (e.g., the pattern 2 x 5 x 7 ends on the 70th element and repeats on the 71st element).

Source: Handel, S. *Listening: An Introduction to the Perception of Auditory Events*. Cambridge, MA: MIT Press, 1989.  
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Handel

PATTERN (LENGTH)

ELEMENTS

1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17

---

ISOCHRONOUS PATTERNS

2(2) X **X**

3(3) X **X**

4(4) X **X**

NON-ISOCHRONOUS

332(8) X **X**

2223(9) X X X X **X**

22233(12) X X X X X **X**

22323(12) X X X X X **X**

23223(12) X X X X X **X**

2223223(16) X X **X** X X X X **X**

33424(16) X X X X X X **X**

Source: Handel, S. *Listening: An Introduction to the Perception of Auditory Events*. Cambridge, MA: MIT Press, 1989.

Courtesy of MIT Press. Used with permission.

# Polyrhythms (polyrhythms:rhythm::polyphony:melody)

Source: Handel, S. Listening: *An Introduction to the Perception of Auditory Events*. Cambridge, MA: MIT Press, 1989.

Courtesy of MIT Press. Used with permission.

		POLYRHYTHMS														
Conlon Nancarrow		Start					ELEMENTS			Repeat						
		1	2	3	4	5	6	7	8	9	10	11	12	13		
	3 x 4	3				3				3				3		
		4			4			4			4			4		
		ELEMENTS														
		1				10				20			30			43
		2								2						2
	2 x 3 x 7	3					3					3				3
		7		7		7		7		7		7		7		7
		ELEMENTS														
		1				18				36			54			71
		2								2						2
	2 x 5 x 7	5				5		5			5		5		5	5
		7		7		7		7		7		7		7		7

# Rhythm & Grouping

- Three examples from
- Bregman & Ahad
- Auditory Scene Analysis CD
- African xylophone music

interference between rhythmic patterns

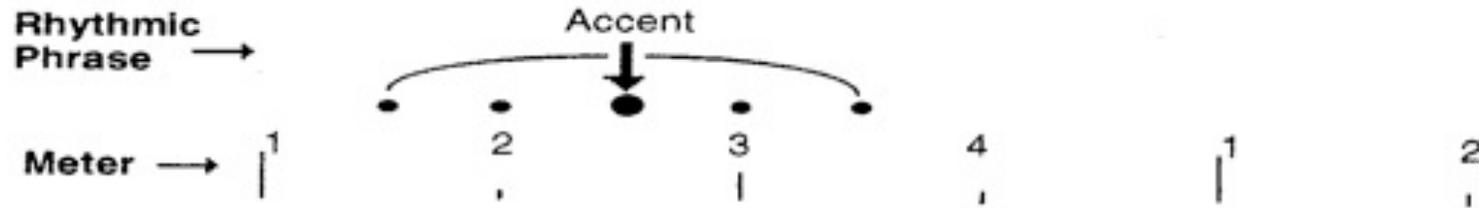
separation of patterns via pitch differences

separation of patterns via timbral diffs

Conflicting rhythms interfere unless the events  
can be separated out in separate streams

# Metrical vs. rhythmic phrases (rel. independence)

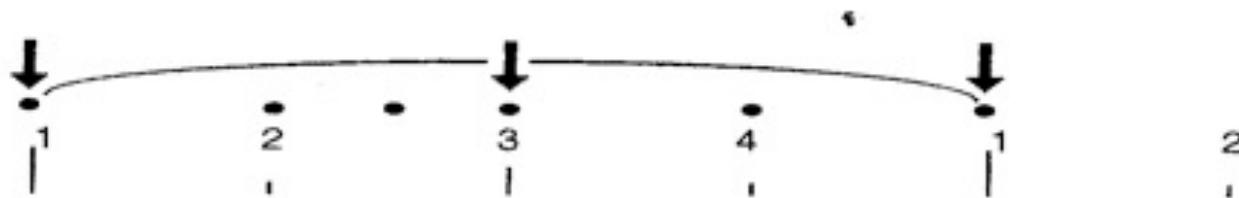
(Snyder, Music & Memory)



Phenomenal accent: louder event in middle of phrase is accented.



Structural accent: first and last events of phrase are accented.



Metrical accent: first and third beats of measure are accented.

Figure 12.4  
Three kinds of accent.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000. Courtesy of MIT Press.  
Used with permission.

# Major points -- rhythm

Rhythm involves perception of temporal patterns of events

Recurring patterns group into chunks that create expectations of future temporal occurrences of events (**rhythmic pattern induction**)

**Rhythmic grouping occurs on the same timescale as melodic grouping.**

We also infer a metrical grid that involves a regular set of timepoints (pulse, tatum) and a regular pattern of accented/unaccented events (meter). (**Metrical induction**)

Expectations generated from rhythmic grouping and metrical induction processes can be manipulated for tension-relaxation effect.

# Time, memory, and anticipation

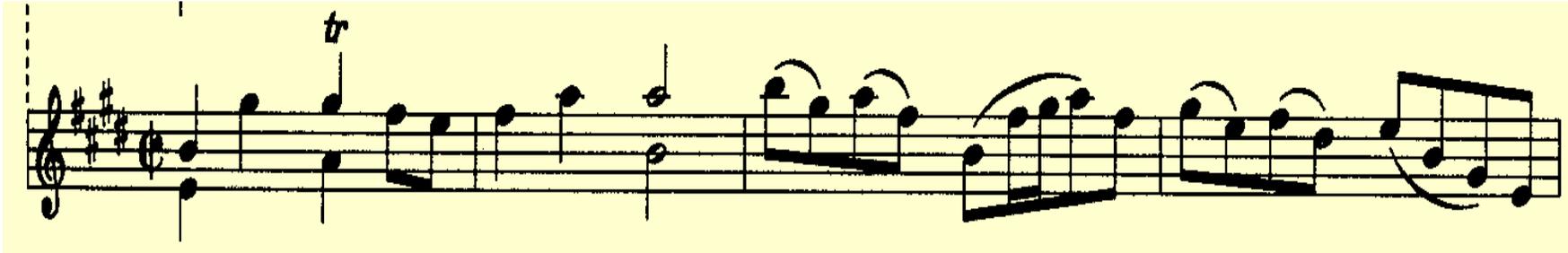


Image of Salvador Dali's painting "The Persistence of Memory"  
removed due to copyright restrictions.

See [http://en.wikipedia.org/wiki/File:The\\_Persistence\\_of\\_Memory.jpg](http://en.wikipedia.org/wiki/File:The_Persistence_of_Memory.jpg)

# Temporal integration windows

(Snyder, Music & Memory)

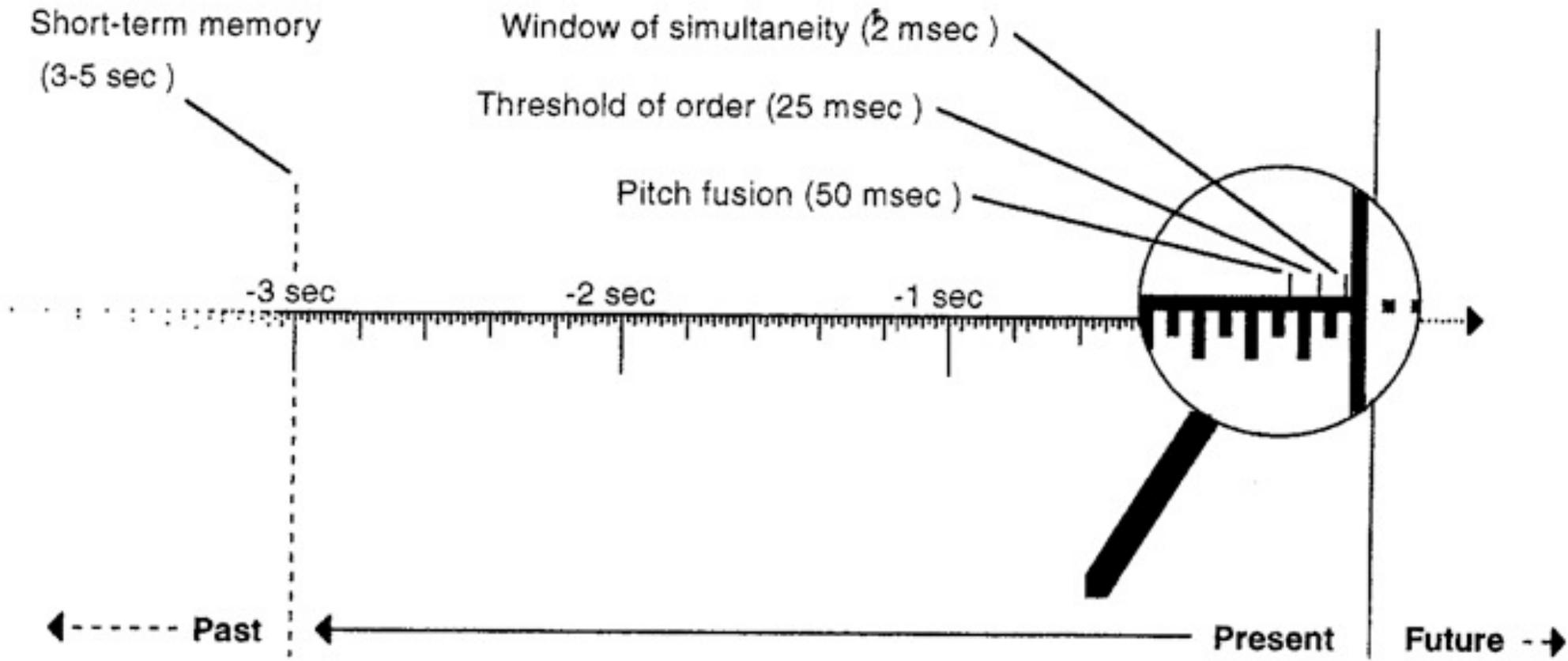


Figure 2.2  
Brain processes and musical time.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000.  
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# Timescales & memory

(Snyder, Music & Memory)

**Table 1.1**  
Three Levels of Musical Experience

	Events per second	Seconds per event
EVENT FUSION (early processing)	16,384	1/16,384
	8,192	1/8,192
	4,096	1/4,096
	2,048	1/2,048
	1,024	1/1,024
	512	1/512
	256	1/256
	128	1/128
	64	1/64
	32	1/32
MELODIC and RHYTHMIC GROUPING (short-term memory)	16	1/16
	8	1/8
	4	1/4
	2	1/2
	1	1
	1/2	2
	1/4	4
	1/8	8
FORM (long-term memory)	1/16	16
	1/32	32
	1/64	1 min 4 sec
	1/128	2 min 8 sec
	1/256	4 min 16 sec
	1/512	8 min 32 sec
	1/1,024	17 min 4 sec
	1/2,048	34 min 8 sec
1/4,096	1 hr 8 min 16 sec.	

melodic and rhythmic grouping,” and the “level of musical form” (see table 1.1).<sup>16</sup> The three types of processing define three basic time scales on which musical events and patterns take place.

Source: Snyder, Bob. *Music and Memory*.  
Cambridge, MA: MIT Press, 2000.  
Courtesy of MIT Press. Used with permission.

# Memory & grouping

(Snyder, Music & Memory)

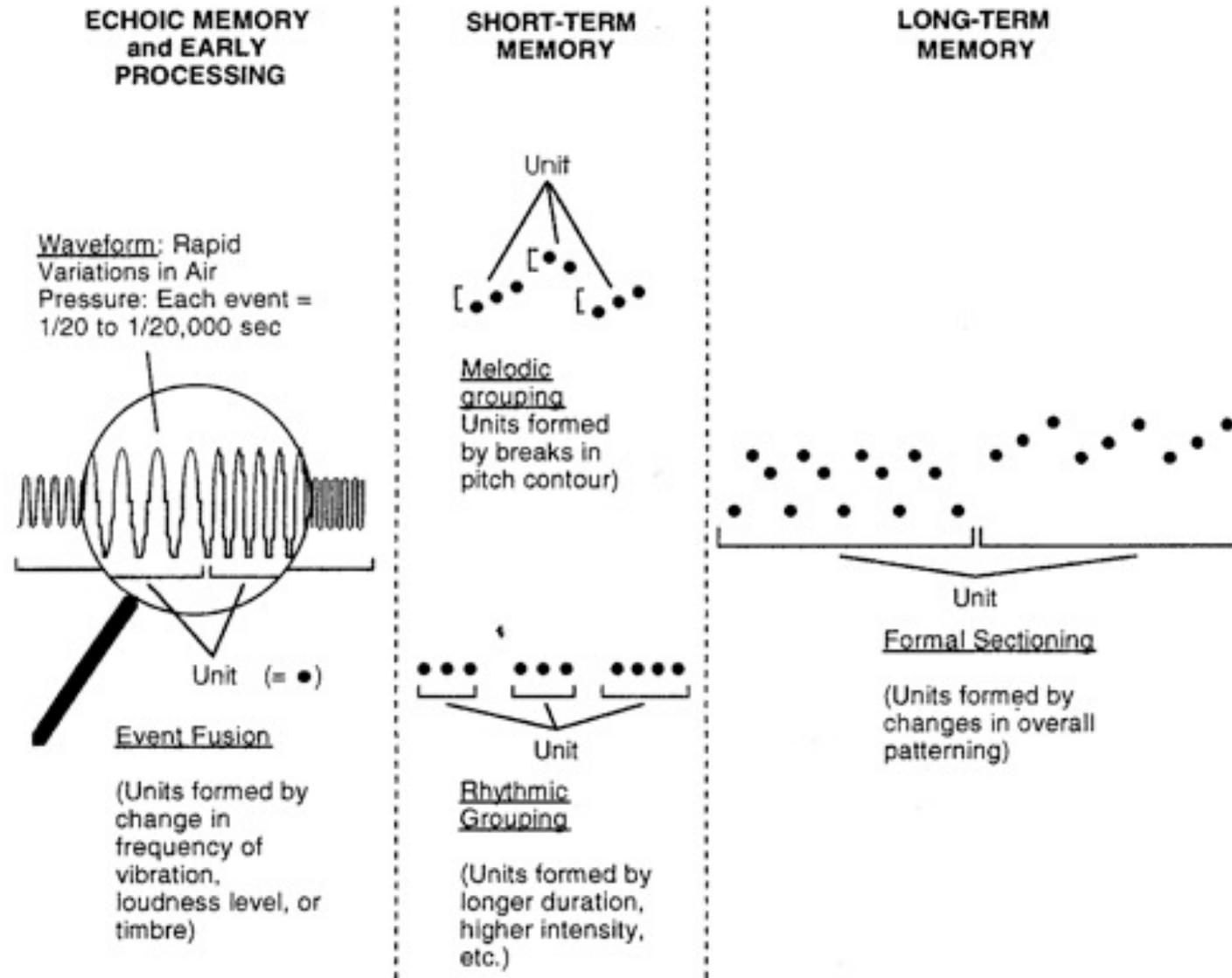


Figure 3.1

Levels of sequential grouping: Event fusion, melodic and rhythmic grouping, and formal sectioning. Note that pattern formation at each level requires comparison of events over increasing time spans. Event fusion requires comparison within 250 msec, melodic and rhythmic patterns require comparison across a time span of from 250 msec to 8 sec, and formal sections require comparisons across a time span of from 8 sec to as much as 1 hour. Also note that each individual unit at one level becomes a part of a unit at the next level up.

Source: Snyder, B. *Music and Memory*.  
Cambridge, MA: MIT Press,  
2000. Courtesy of MIT Press.  
Used with permission.

# Memory processes generate musical context

**Tonality induction -- repetition of particular notes & sets of harmonics that establishes a tonal expectation through which all subsequent incoming tonal patterns are processed -- establishment of the tonic**

**Rhythmic induction -- repetition of patterns of accented and unaccented events that establishes a temporal pattern of expectation for subsequent events**

**Both kinds of induction operate on similarities and contrasts between previous and subsequent sounds & events**

**OLD + NEW heuristic:**

- 1) OLD incoming patterns similar to previous ones build up the images of previous ones, confirm + strengthen expectations, create relaxation**
- 2) NEW different patterns create contrasts that violate expectations established from previous inputs, create tension**
- 3) degree of contrast (distance in perceptual space) determines**

# Time, memory, and anticipation



# Time

**What is time? Newtonian & Bergsonian time**

**The perception of time**

**Duration, succession, and perspective**

**Relativity of time**

**Constant Weber fraction for time estimation**

**Aging & time perception (internal clocks slow down)**

**Duration and event-density**

**Learning & temporal prediction (anticipation)**

**Brains as temporal prediction machines**

**Models of time (interval) perception & production**

**Clock models -- accumulators (hourglass)**

**Oscillator models (pendulum)**

**Delay-detectors and static representations of time**

**Rhythmic hierarchies, simple ratios, and groupings**

**Temporal memory traces (delay loops, cyclochronism)**

# Time

"time...does not exist without changes." Aristotle, Physics, IV

Time as an absolute world-coordinate (Newtonian time) vs. time as epistemic change (psychological, Bergsonian time)

"A man in sound sleep, or strongly occupy'd with one thought, is insensible of time... Whenever we have no successive peceptions, we have no notion of time, even tho' there be a real succession in the objects...time cannot make its appearance to the mind, either alone, or attended with a steady unchangeable object, but is always discovered by some perceivable succession of changeable objects." Hume as quoted in Fraisse, pp. 3-4

Measurement of time

How is time measured, psychologically, by the neural mechanisms and informational organizations that constitute our minds?

# Duration

60 BPM

**Our sense of the length of time** (Fraisse, 1962, *The Psychology of Time*)

152 BPM

**Constant Weber fractions for interval estimation**

**Errors are proportional to the interval estimated**

**Weber's law for timing; jnd's on the order of 8-12%  
depending on modality (hearing, touch, vision)**

**Temporal prediction of reward in conditioning**

**(Scalar timing intimately related to the response latency in conditioning when interval between stimulus and reward are varied, see R. Church, *A Concise Introduction to Scalar Timing Theory*, 2003. See also Fraisse's (1963) discussion of Pavlov and Popov cyclochronism model)**

**Some general observations** (Fraisse via Snyder, *Music & Memory*):

**Filled time durations appear shorter than empty ones**

**Rate of novel events makes durations appear shorter**

**(monotonous durations are experienced as longer, but remembered as shorter)**

**Aging: young children overestimate durations; older adults underestimate durations**

**(A systematic change in internal timing mechanisms with age? cf  $\Delta$ absolute pitch)**

**Implications for music: pieces with high event densities go faster; those with low ones seem to take forever; duration is in the mind of the beholder and his/her expectations**

# Beat induction and duration discrimination

## Weber's Law

Image removed due to copyright restrictions.

Graph illustrating Weber's Law. See Fig. 4.13 in Jones and Yee,  
"Attending to auditory events: the role of temporal organization."

In *Thinking in Sound*. Edited by E. Bigand and S. McAdams.

New York, NY: Oxford University Press, 1993. ISBN: 9780198522577.

# Succession

**Time order:**

**before and after (Fraisse, Snyder)**

**Our recollection of time order depends on memory mechanisms, how distant in the past were the events**

**Representation of order in long-term memory is poor**

**LTM is massively parallel, not serial**

**Time order within chunks is better preserved than between them**

**Primacy and recency: first and last elements in a chunk best remembered, most salient**



# **Perspective: Past, present, future**

**Mediated by different psych/brain mechanisms**

**Past: long term memory**

**Present: working memory**

**Future: anticipation, planning**

**Music (like sports) focuses our minds on the present, on events that have occurred in the last few seconds to minutes.**

# Mechanisms of timing and temporal processing

- Temporal contiguity models of learning
- Clock models
  - Switched accumulator, e.g. hourglass
  - Explicit measurement of time durations
  - Ordering of durations by magnitude
- Time delay detectors/generators
  - Array of tuned delay elements, detectors, oscillators
  - Explicit measurement of time durations; storage of patterns
  - Generators of time delays (timers)
- Rhythmic hierarchies (Jones)
  - well-formed patterns create strong expectations
- Temporal memory trace
  - Timeline of events stored in reverberating memory
  - Readout of events & (timing of) their consequences

## Temporal expectations on different timescales

- Pitch: repetitions on microtemporal timescales (200 usec to 30 ms)
- Infra-pitch: not well defined, repetitions with periods 30-100 ms
- Rhythms: patterns of individuated events with periods 100 ms to several secs
- Longer temporal expectations (> few secs)

# Metrical and nonmetrical patterns (cf. tonal & atonal melodies)

Image removed due to copyright restrictions.

See Fig. 4.8 in Jones and Yee, "Attending to auditory events:  
the role of temporal organization." In *Thinking in Sound*.

Edited by E. Bigand and S. McAdams. New York, NY:  
Oxford University Press, 1993. ISBN: 9780198522577.

*Jones & Yee,*

Attending to auditory events:

the role of temporal organization

in *Thinking in Sound*

# Temporal reproductions are better for well-formed temporal patterns

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See Fig. 4.9 in Jones and Yee, "Attending to auditory events: the role of temporal organization." In *Thinking in Sound*. Edited by E. Bigand and S. McAdams. New York, NY: Oxford University Press, 1993. ISBN: 9780198522577.

# Higher-order (longer-range) metrical patterns

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See Fig. 4.7 in Jones and Yee, "Attending to auditory events: the role of temporal organization." In *Thinking in Sound*.

Edited by E. Bigand and S. McAdams. New York, NY: Oxford University Press, 1993. ISBN: 9780198522577.

# Hierarchical & nonhierarchical ratios of event timings

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See Fig. 4.10 in Jones and Yee, "Attending to auditory events: the role of temporal organization." In *Thinking in Sound*.

Edited by E. Bigand and S. McAdams. New York, NY: Oxford University Press, 1993. ISBN: 9780198522577.

# Clock & hierarchical models of beat perception

Image removed due to copyright restrictions.

See Fig. 4.11 in Jones and Yee, "Attending to auditory events: the role of temporal organization." In *Thinking in Sound*.

Edited by E. Bigand and S. McAdams. New York, NY: Oxford University Press, 1993. ISBN: 9780198522577.

# Mechanisms of timing and temporal processing

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  - Generators of time delays (timers)
- Rhythmic hierarchies (Jones)
  - well-formed patterns create strong expectations
- Temporal memory trace
  - Timeline of events stored in reverberating memory
  - Cyclochronism (Popov, see Fraisse, memory store is itself temporal)
  - Readout of events & (timing of) their consequences

# Warren: Holistic & analytic sequence recognition

holistic:  
temporal  
compounds  
(cohere into  
unified  
patterns)

analytic:  
explicit ID  
of elements  
and orders

Image removed due to copyright restrictions.

See Fig. 3.2 in Warren, "Perception of acoustic sequences:

global integration vs. temporal resolution." In *Thinking in Sound*.

Edited by E. Bigand and S. McAdams. New York, NY: Oxford University Press, 1993. ISBN: 9780198522577.

# Timescale similarities & differences of temporal processing

- On all timescales:
  - mechanisms for internalizing timecourses of events, for building up temporal patterns
- Differences between timescales
  - Pitch: support of multiple patterns (pitch mechanism low harmonics) => temporal "transparency", non-interference
  - Rhythm: interference between patterns unless separated into different streams
  - another way of thinking about this is that for rhythm stream formation mechanism is not based on periodicity alone

## Licklider's (1951) duplex model of pitch perception

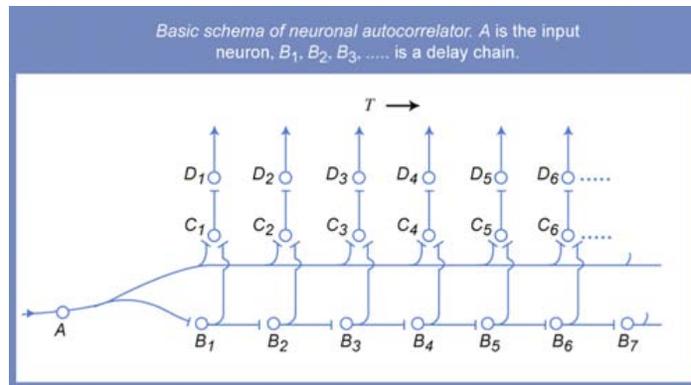


Figure by MIT OpenCourseWare.

## Licklider's binaural triplex model

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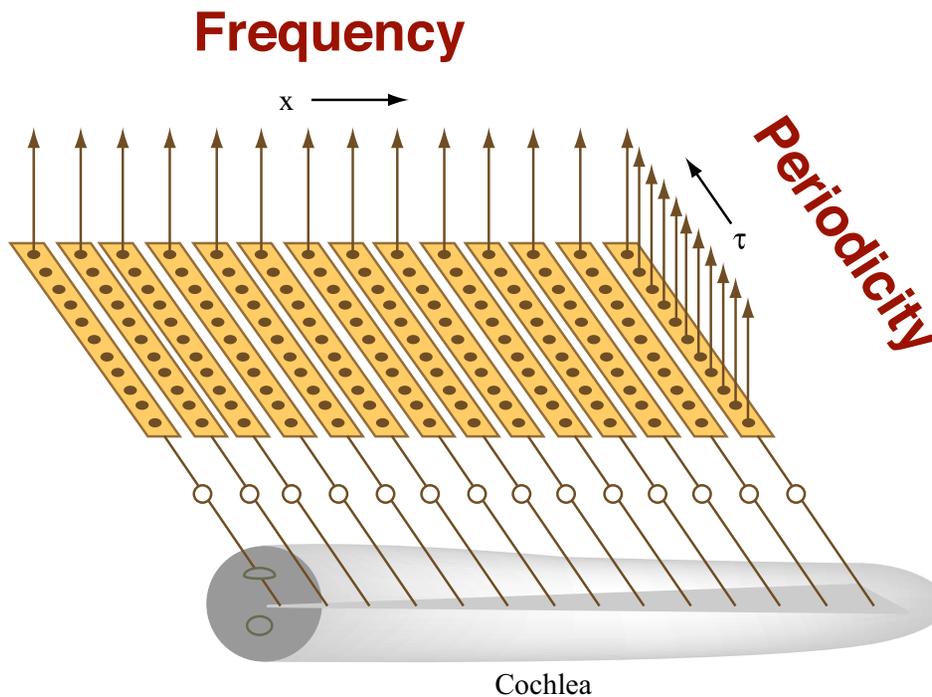


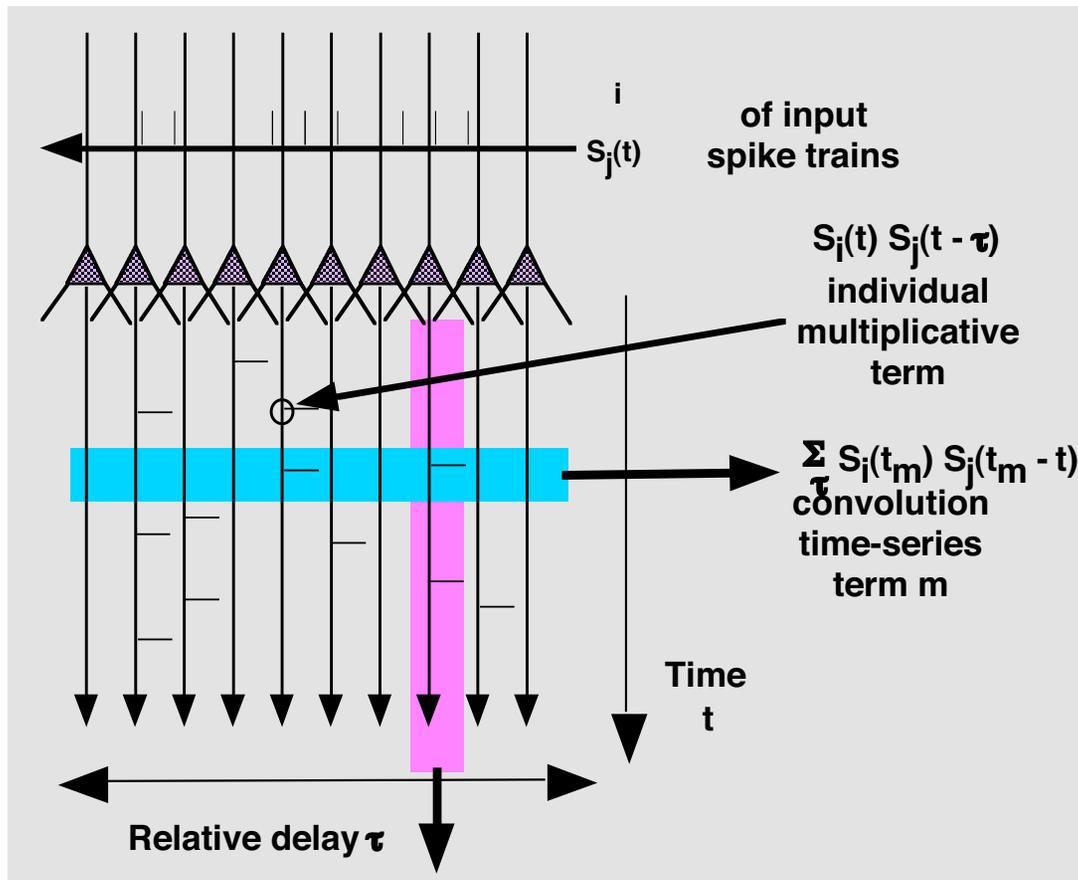
Figure by MIT OpenCourseWare.

J.C.R. Licklider (1959) "Three Auditory Theories" in *Psychology: A Study of a Science*, Vol. 1, S. Koch, ed., McGraw-Hill, pp. 41-144.

# Neural timing nets

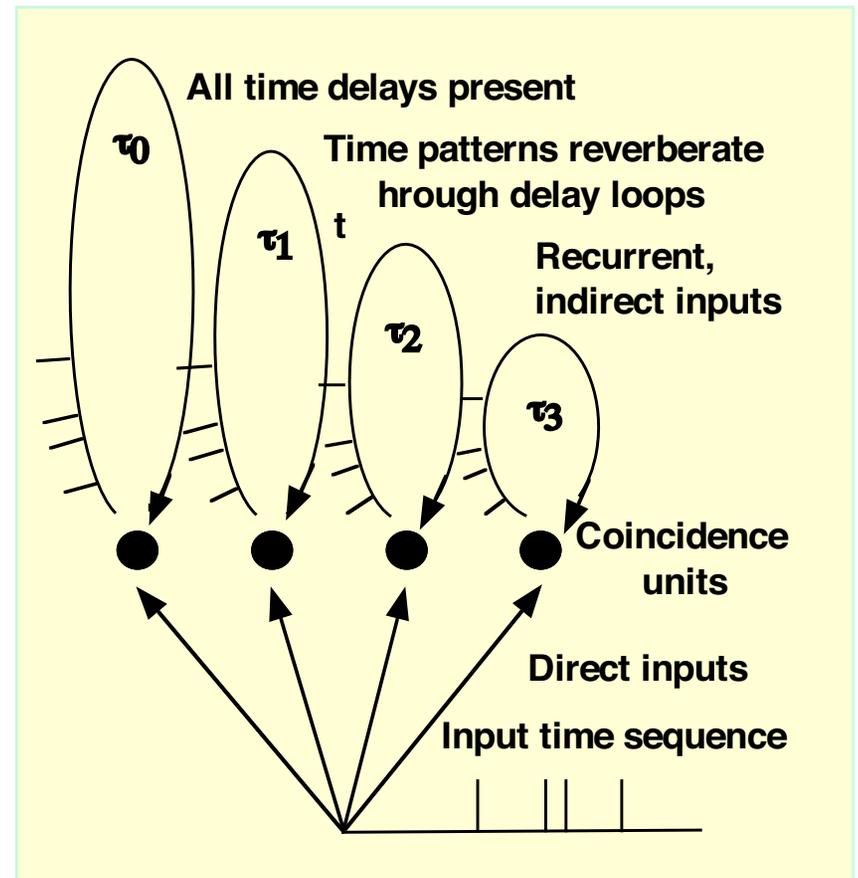
## FEED-FORWARD TIMING NETS

- Temporal sieves
- Extract (embedded) similarities
- Multiply autocorrelations



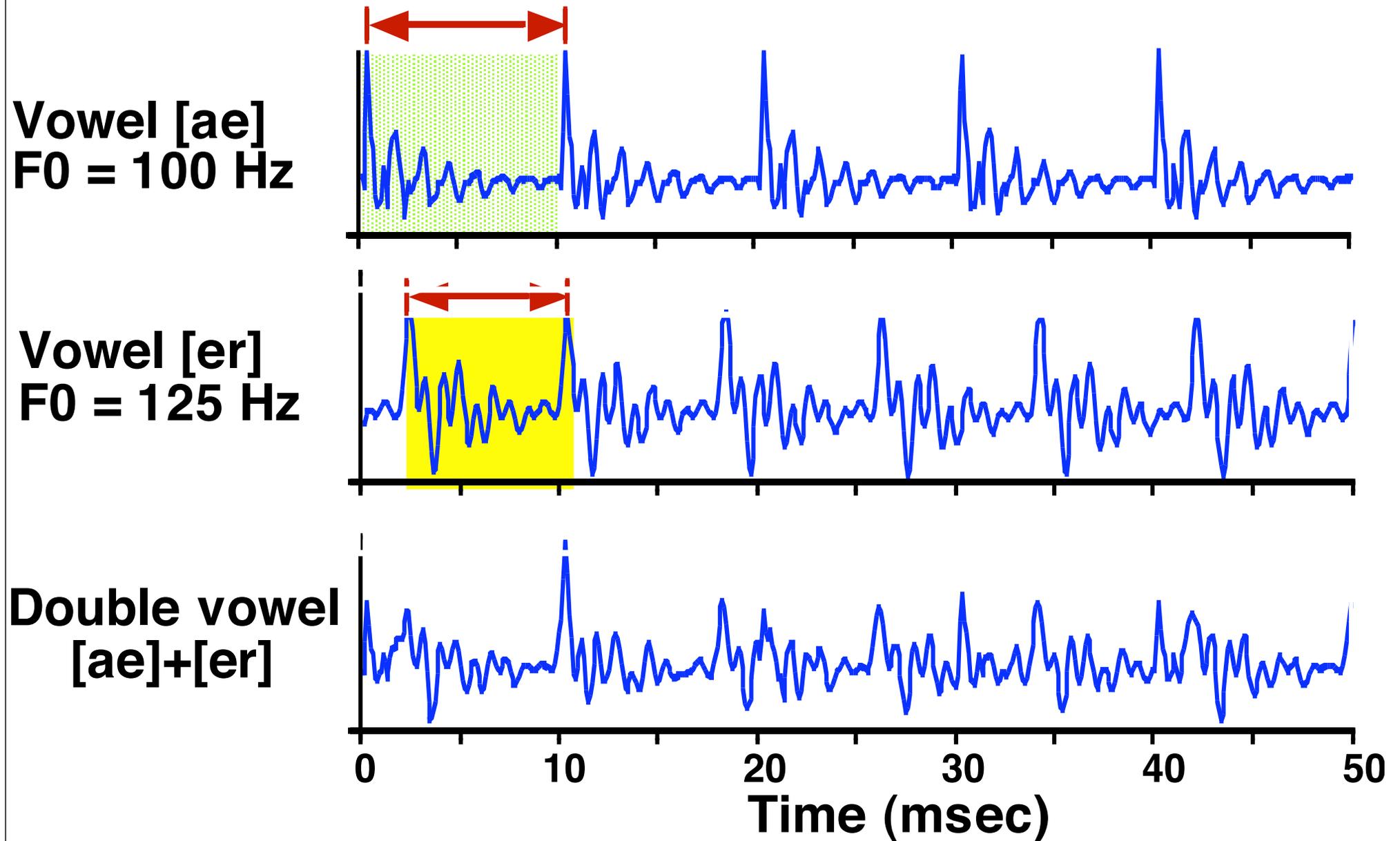
## RECURRENT TIMING NETS

- Build up pattern invariances
- Detect periodic patterns
- Separate auditory objects



# Is a time-domain strategy possible?

## Effect of different F0s in the time domain



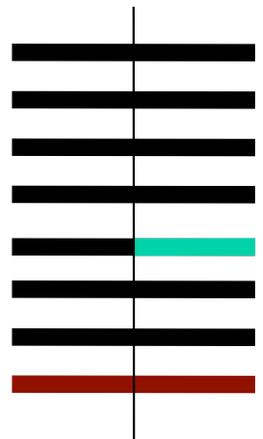
# Auditory "pop-out" phenomena suggest a period-by-period

**Waveform**  
 F0 = 100; Harmonics 1-8  
 Δ 4th harmonic

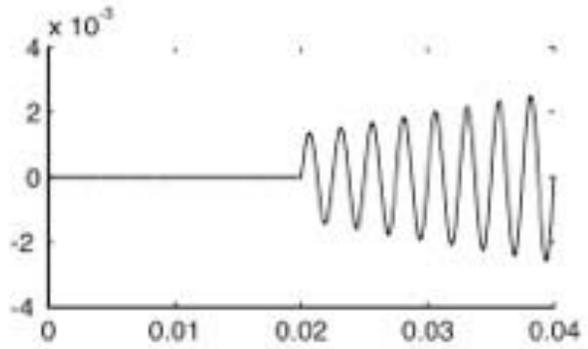
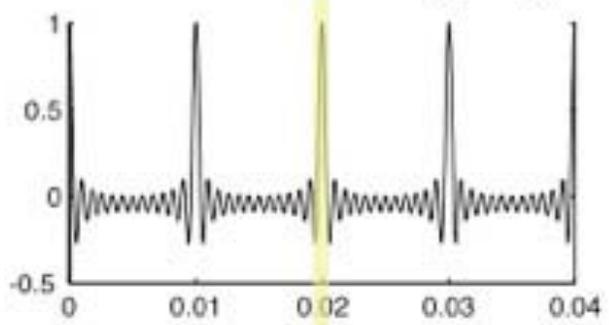
**Deviation from periodic pattern**

Last 2 periods - first 2

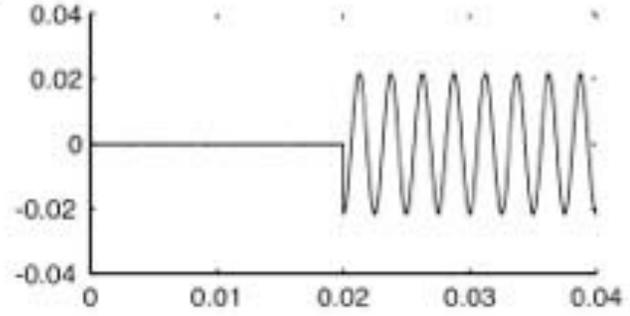
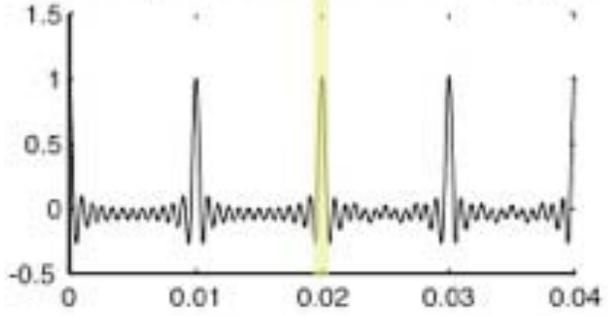
**transient disparity**



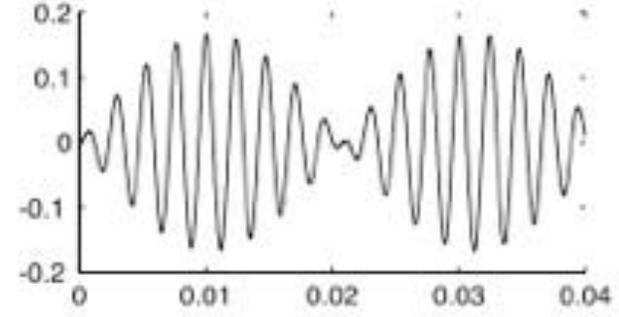
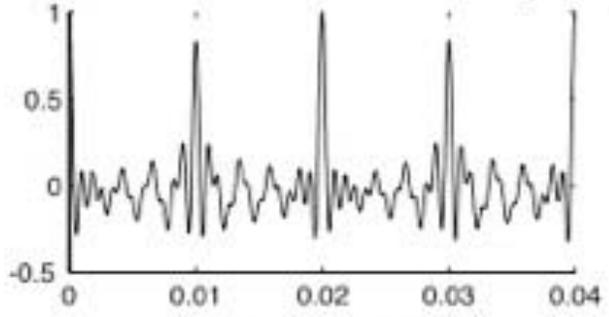
**Phase transient (pi/4)**



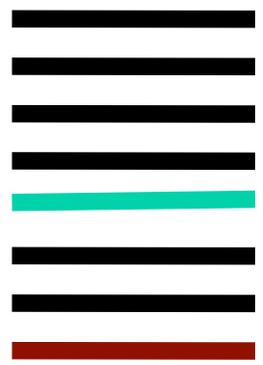
**Amplitude transient (2 dB)**



**Mistuned harmonic (12%)**



**ongoing disparity**



Time (s)

Time (s)

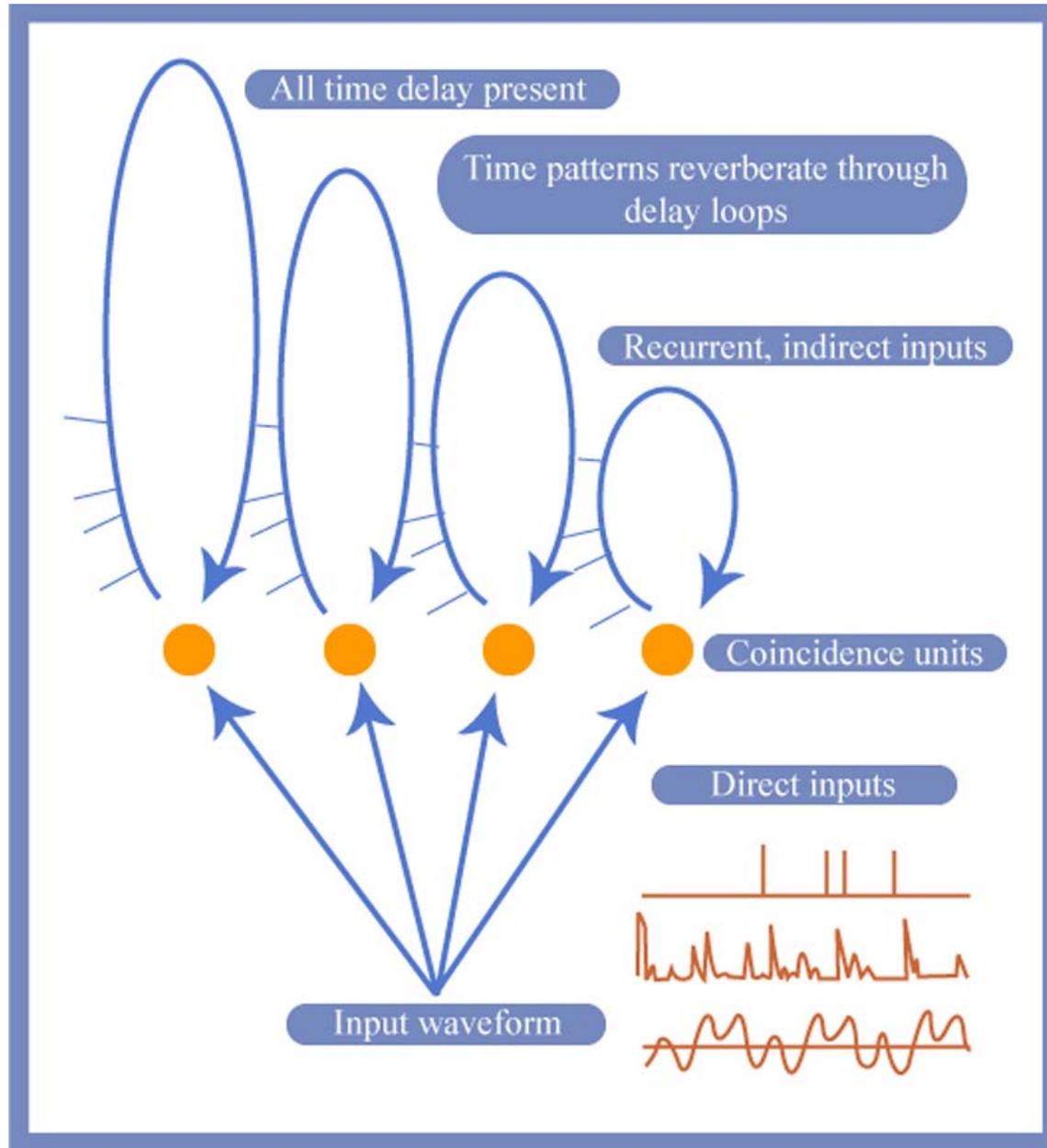
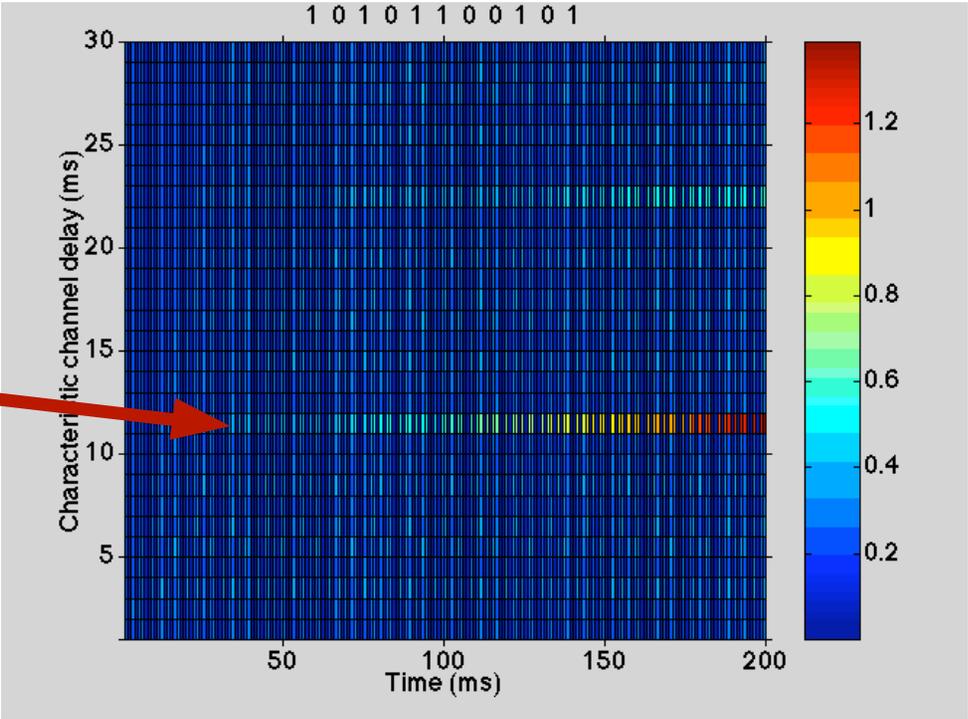
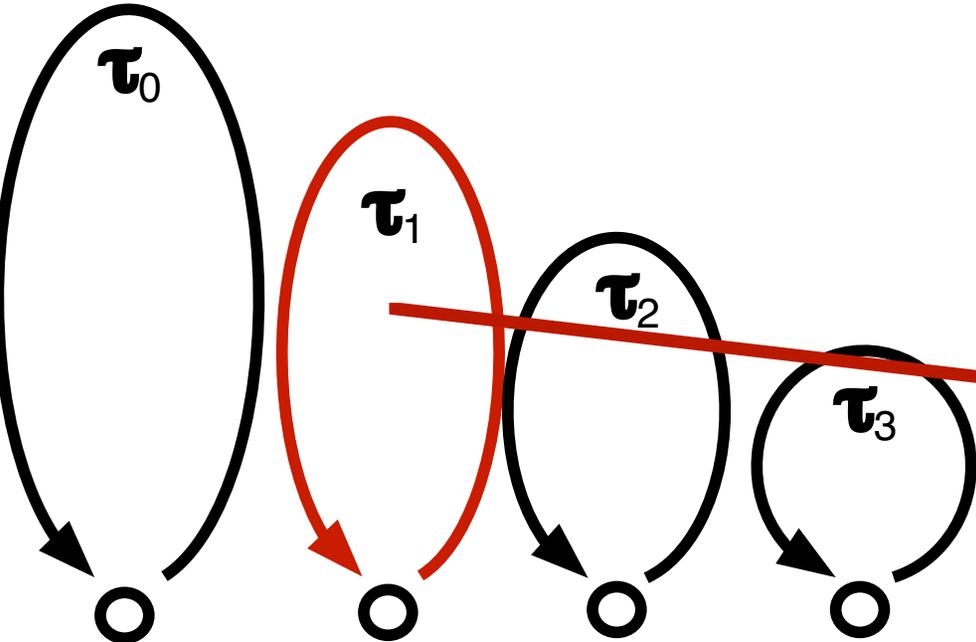


Figure by MIT OpenCourseWare.

# Detection of arbitrary periodic patterns

Periodic patterns invariably build up in delay loops whose recurrence times equals the period of the pattern and its multiples.



$\tau_1 = 11 \text{ ms} =$  recurrence time of input pattern `10101100101`

**Input pattern**

`1010110010110101100101101011001011010...`

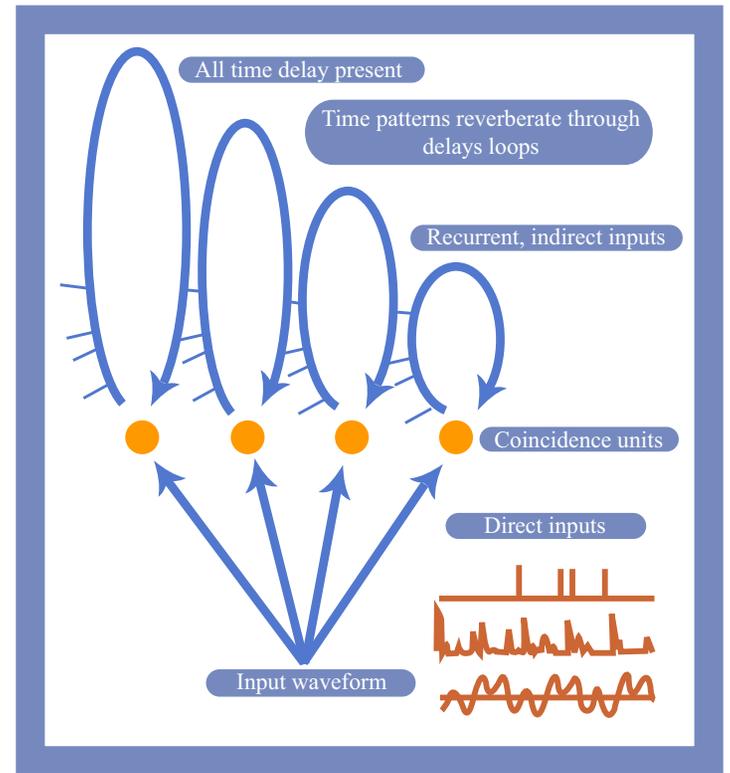
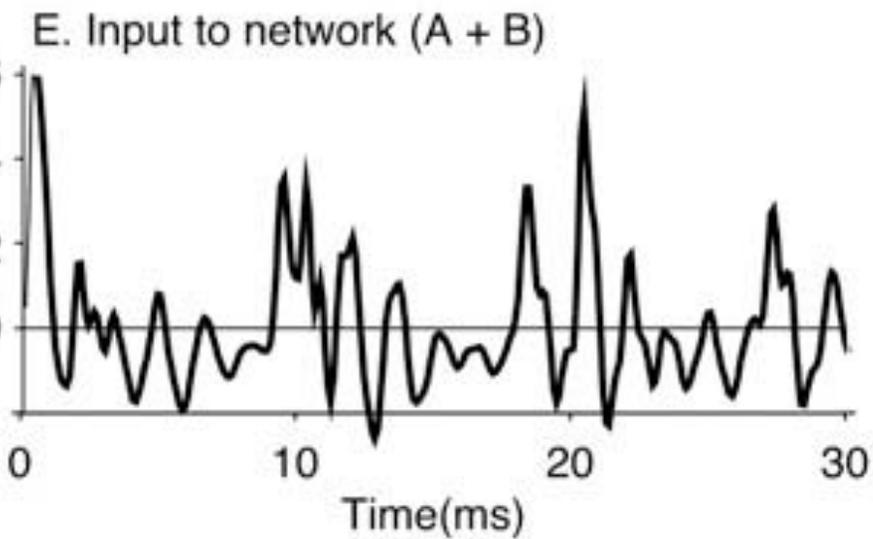
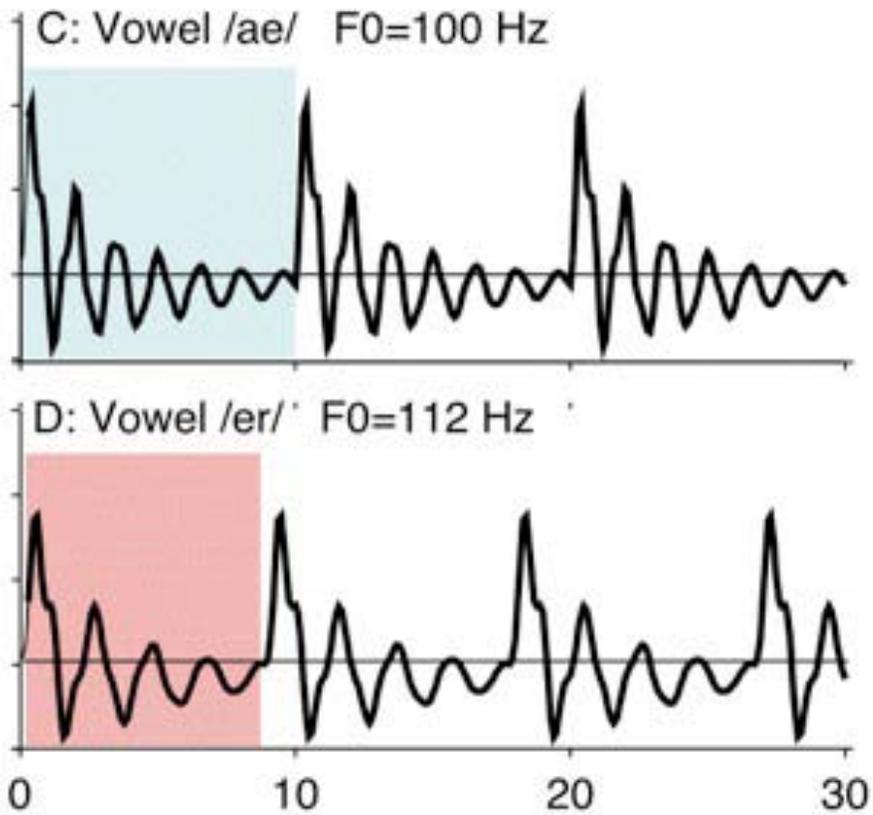
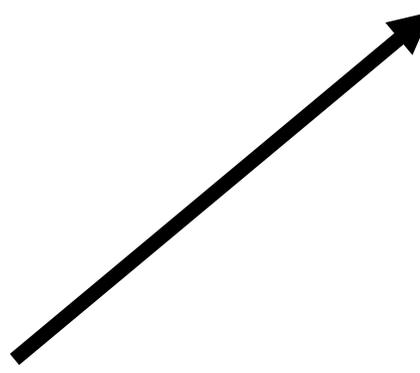
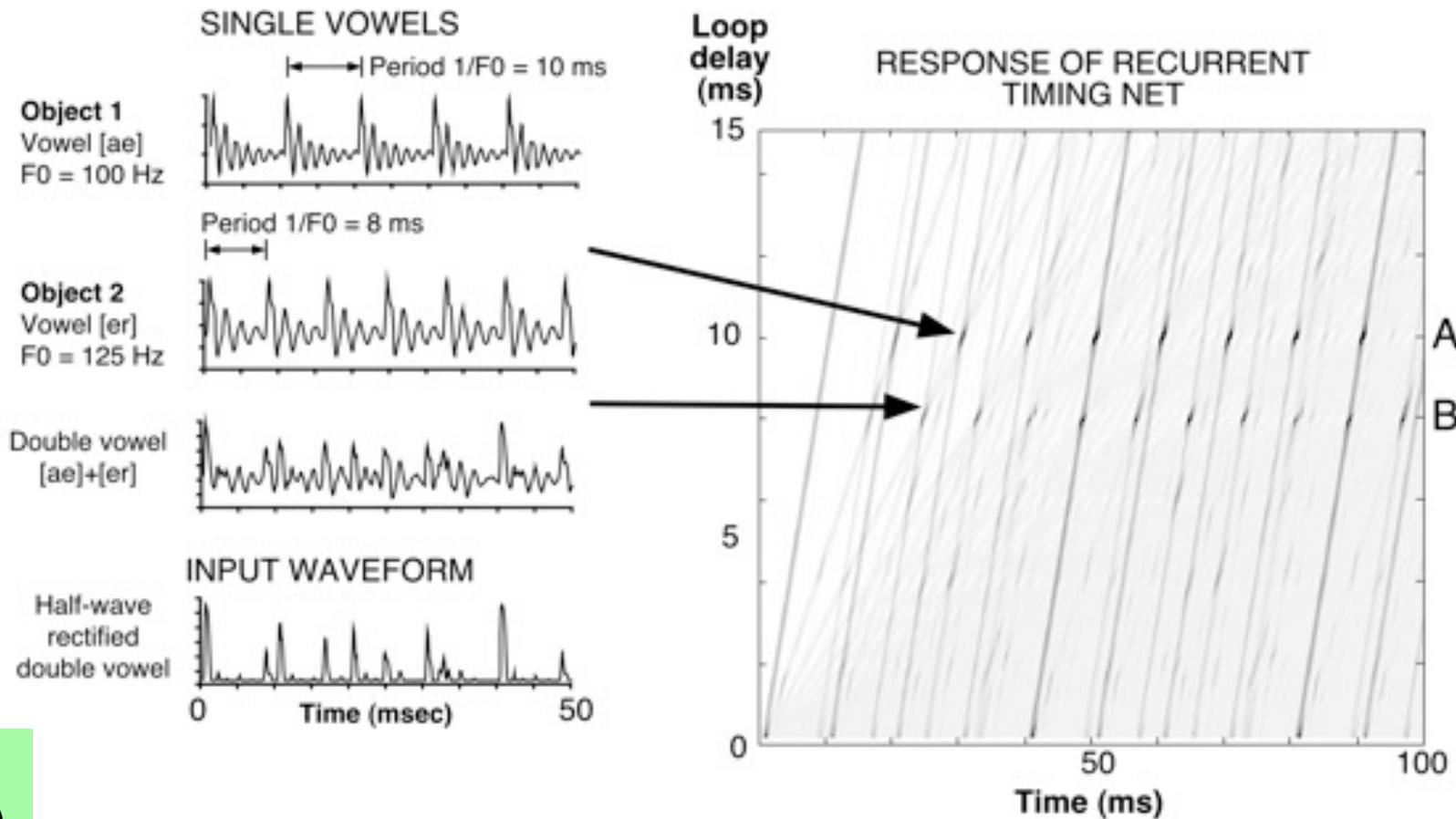


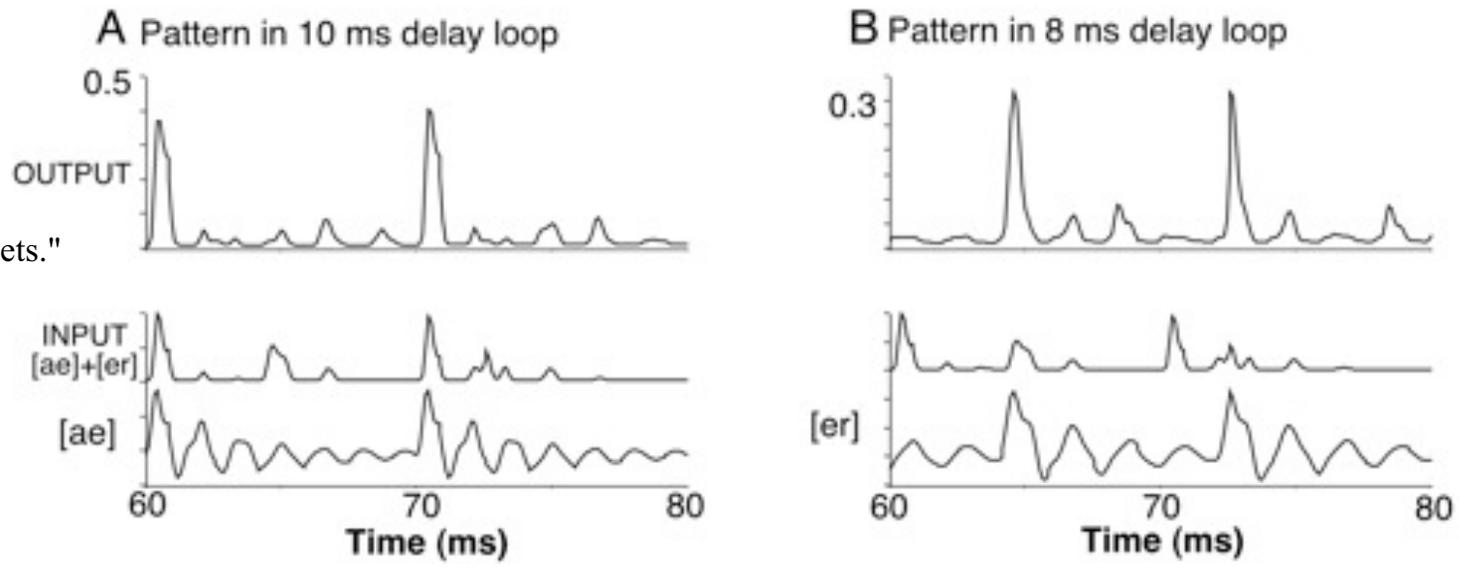
Figure by MIT OpenCourseWare.



# Recurrent timing net with single

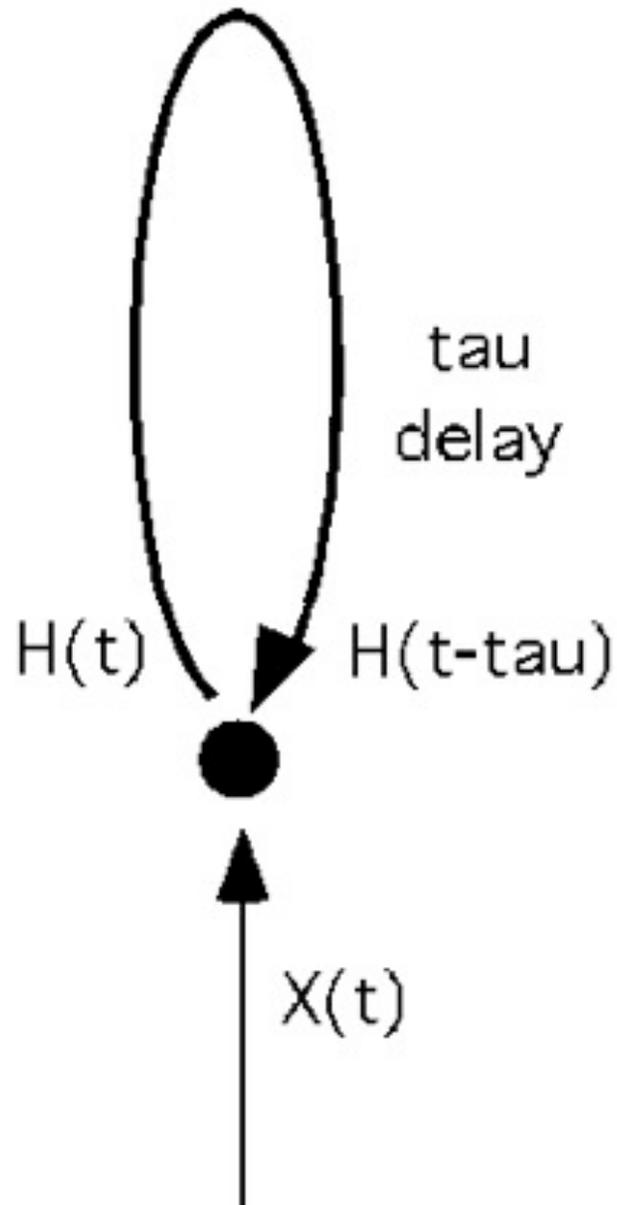


**Revised buildup rule:  
Min(direct, circulating)  
plus a fraction of their  
absolute difference**



Source: Cariani, P. "Neural Timing Nets."  
*Neural Networks* 14 (2001): 737-753.  
Courtesy Elsevier, Inc.,  
<http://www.sciencedirect.com>.  
Used with permission.

## Signals

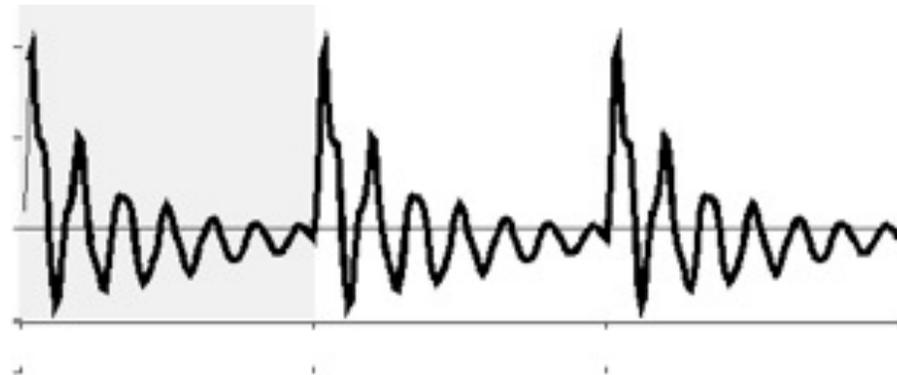


## Error-adjustment rule:

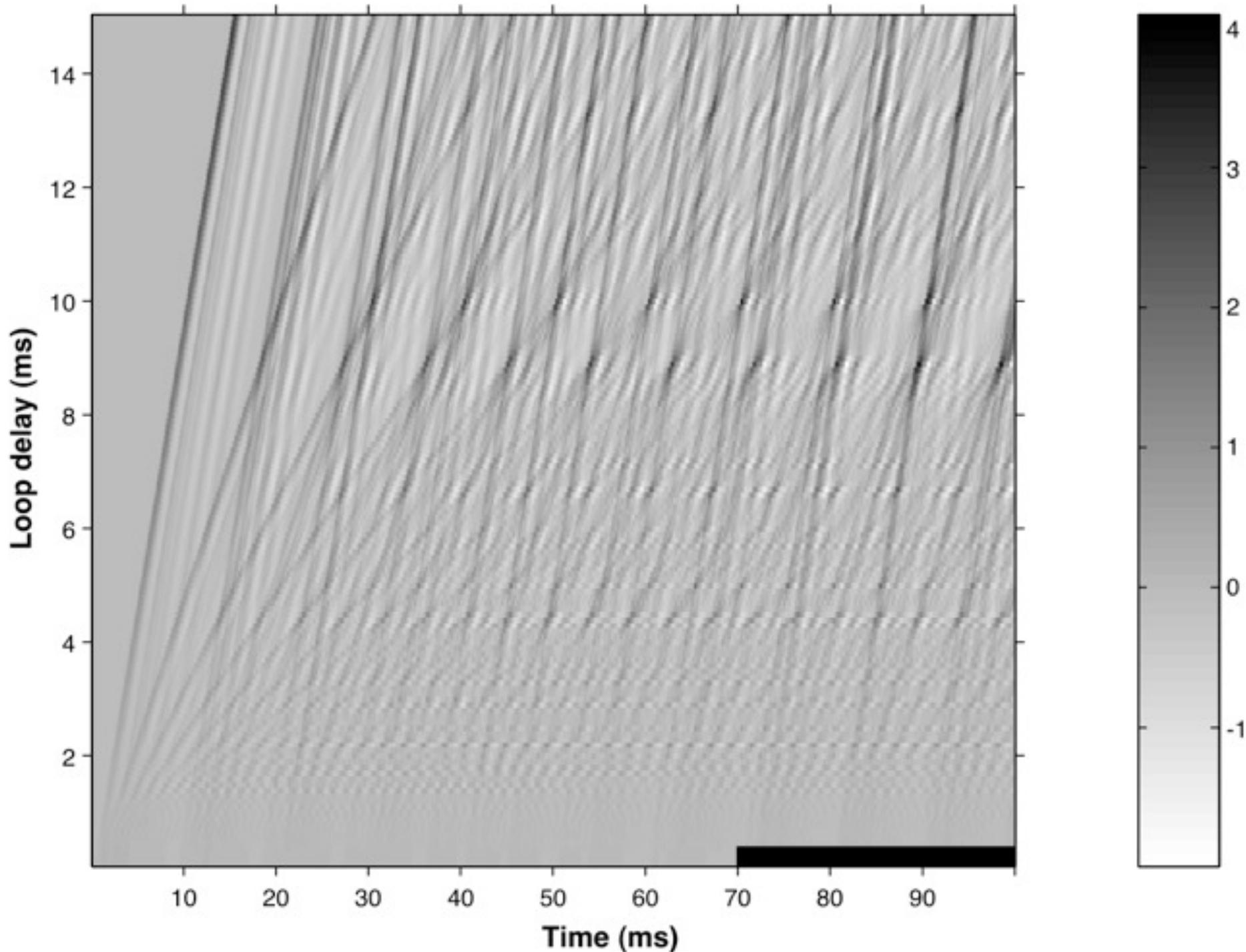
$$H(t) = H(t-\tau) + B_{\tau}[X(t)-H(t-\tau)]$$

## Loop-dependent scaling of adj rate:

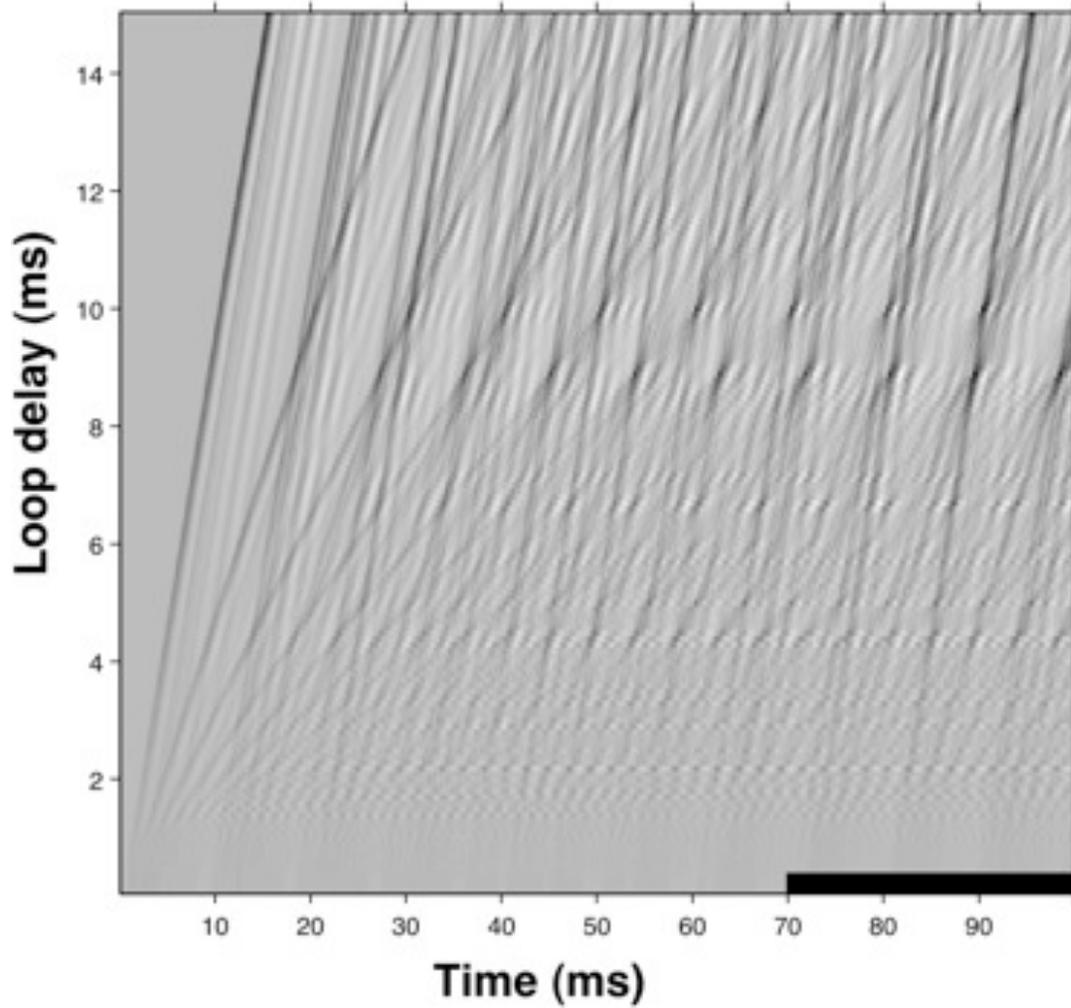
$$B_{\tau} = \tau/33 \text{ ms}$$



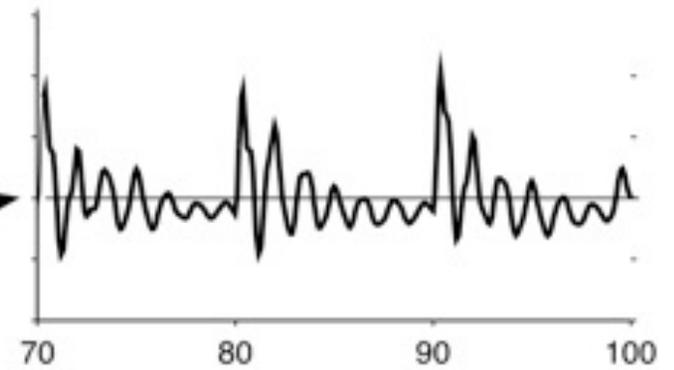
# F. RESPONSE OF RECURRENT TIMING NET



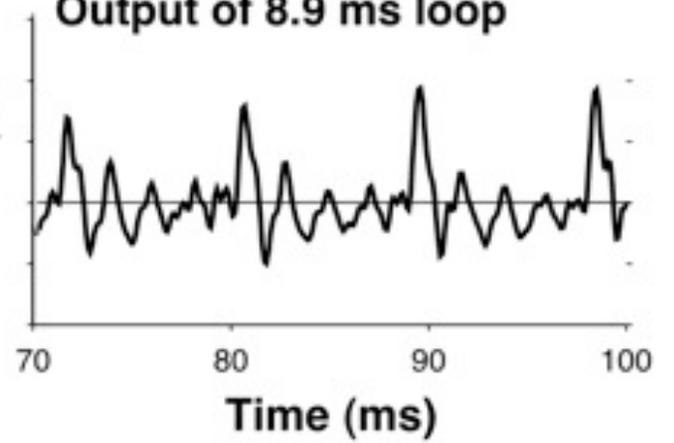
# RESPONSE OF RECURRENT TIMING NET



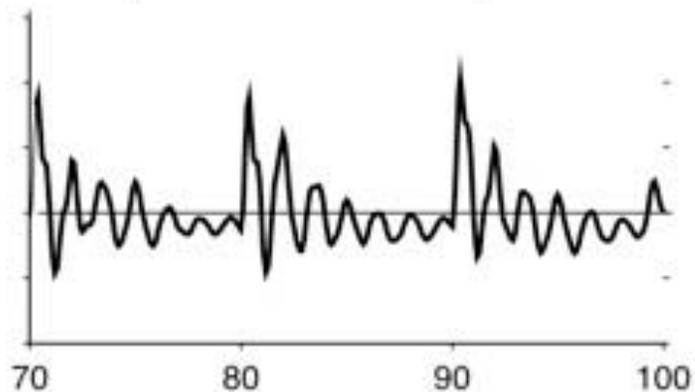
## Output of 10 ms loop



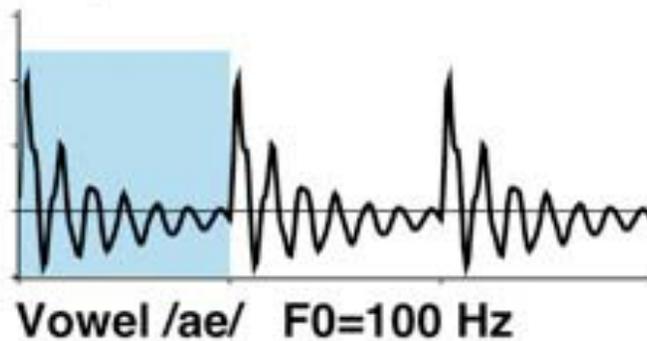
## Output of 8.9 ms loop



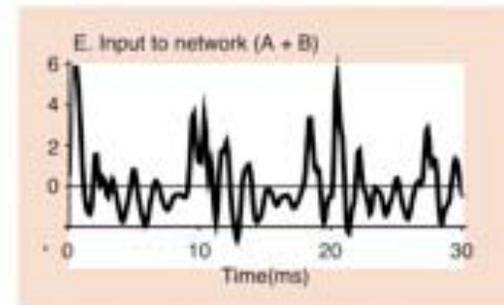
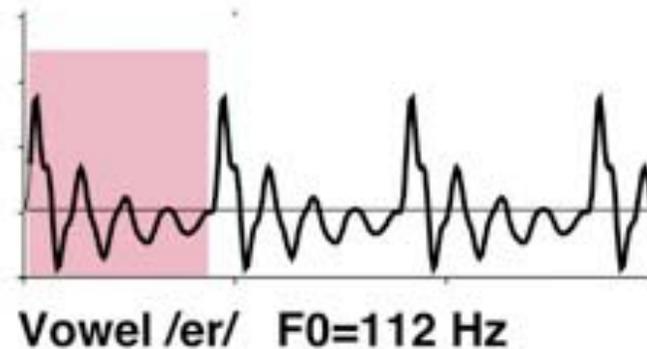
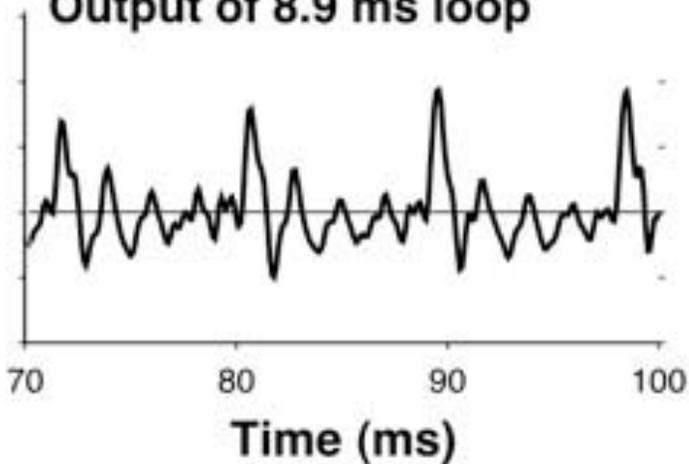
Output of 10 ms loop



Original individual vowels



Output of 8.9 ms loop

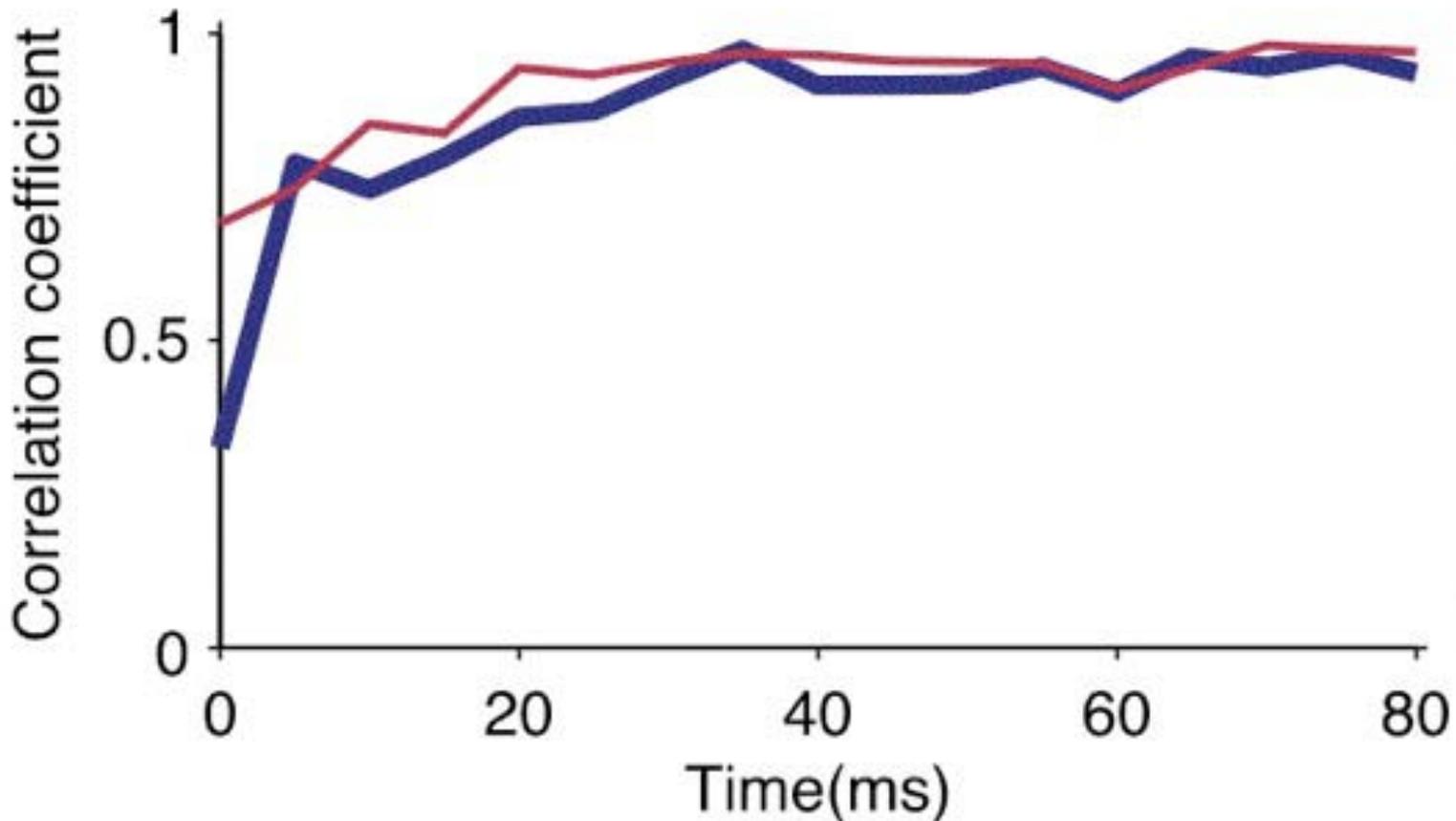


# Correlations of loop outputs to individual vowels

Correlations between autocorrelations

**Thick:** 10 ms loop waveform vs. /ae/

**Thin:** 8.9 ms loop waveform vs. /er/



# **Tonal & rhythmic contexts**

## **Tonality induction:**

**establishment of a tonic**

**establishment of tonal system: key, mode, set of pitches**

**establishment of harmonic relations**

## **Western tonal music:**

**Relations of notes to the tonic**

**Relations of notes to the triad that defines the key (I)**

**harmonic center**

**Relations of chords to I triad & tonic -- chord progressions**

**Distance in perceptual similarity**

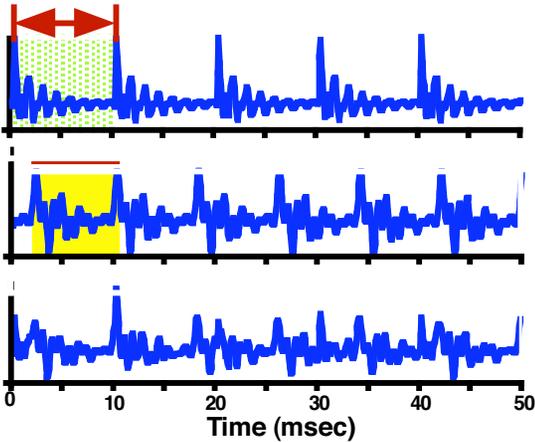
**Tension-resolution + movement between the two**

**Relations of different keys and key modulations**

**Movements between keys, tension-resolution, larger structures & rhythms of harmonic movement**

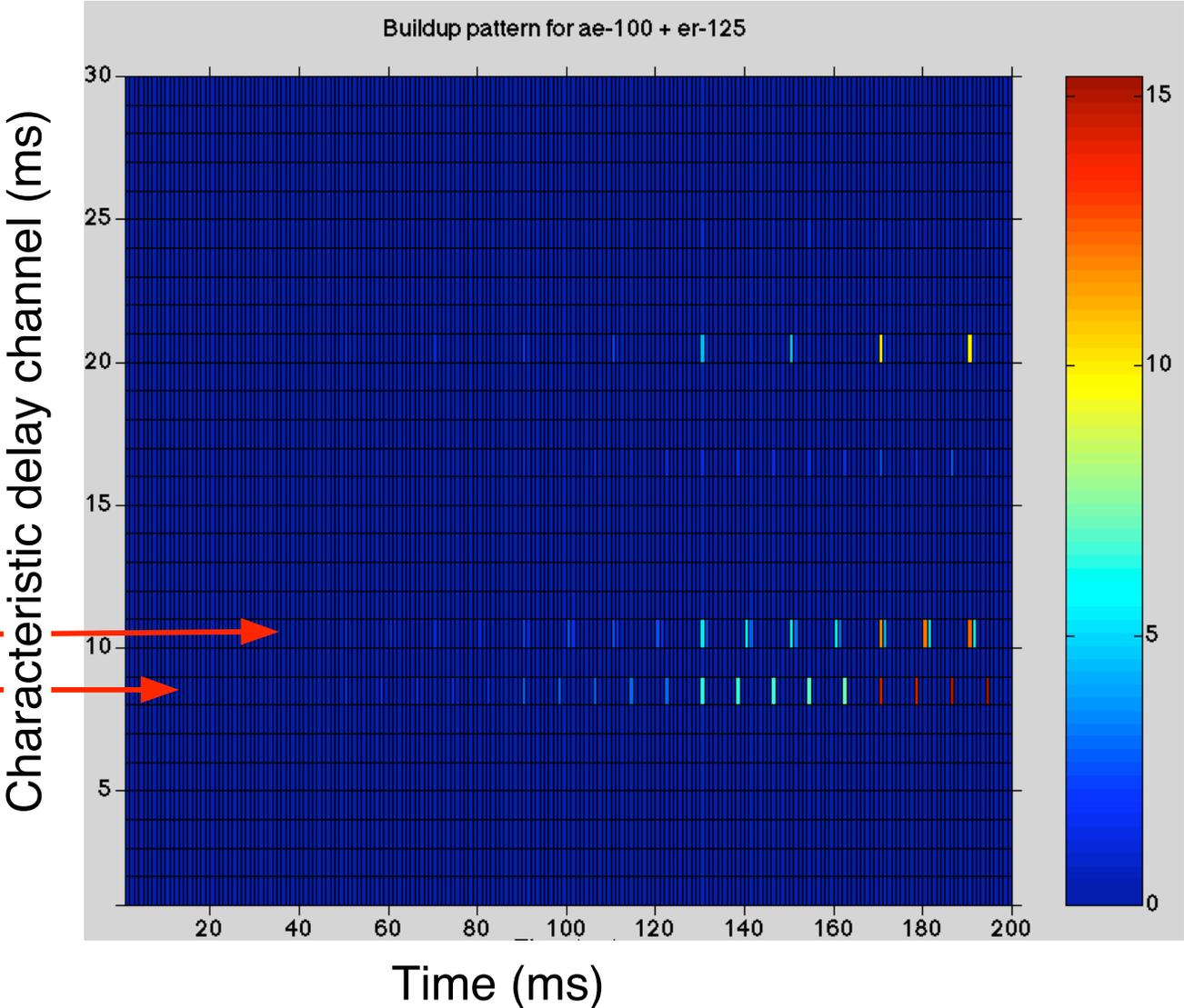
# Build-up and separation of two auditory objects

Two vowels with different fundamental frequencies (F0s) are added together and passed through the simple recurrent timing net. The two patterns build up in the delay loops that have recurrence times that correspond to their periods.

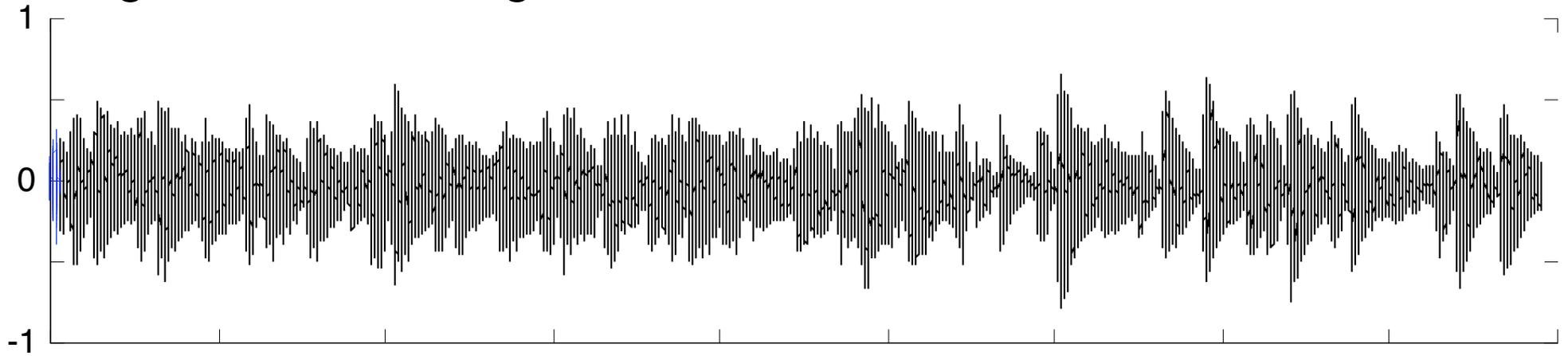


**Vowel [ae]**  
**F0 = 100 Hz**  
**Period = 10 ms**

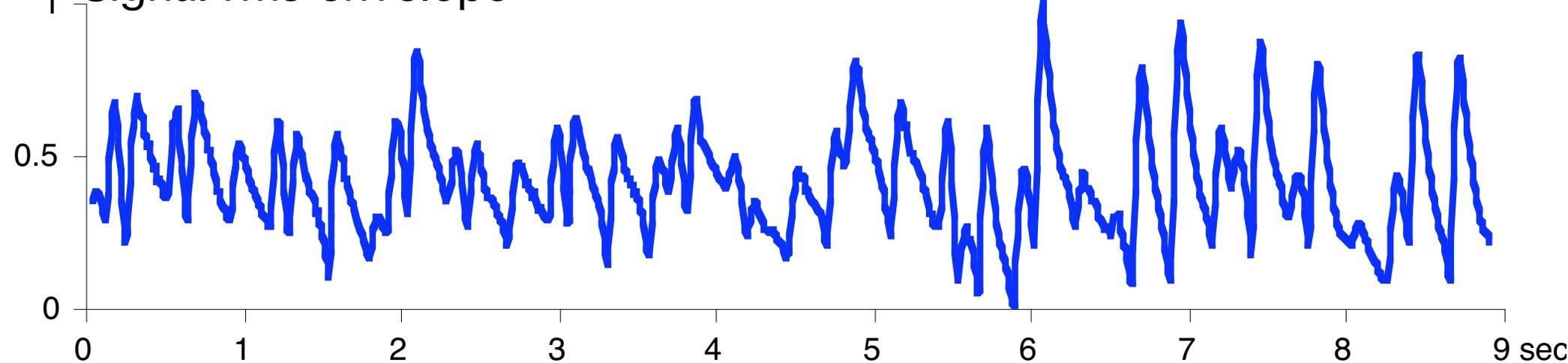
**Vowel [er]**  
**F0 = 125 Hz**  
**Period = 8 ms**



## Fragment from G. Ligeti's *Musica Ricercata*



## Signal rms envelope

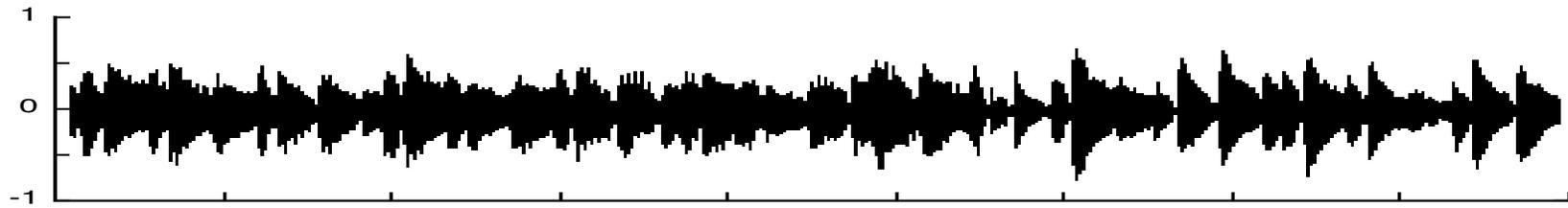


This image is from the article Cariani, P. "Temporal Codes, Timing Nets, and Music Perception."

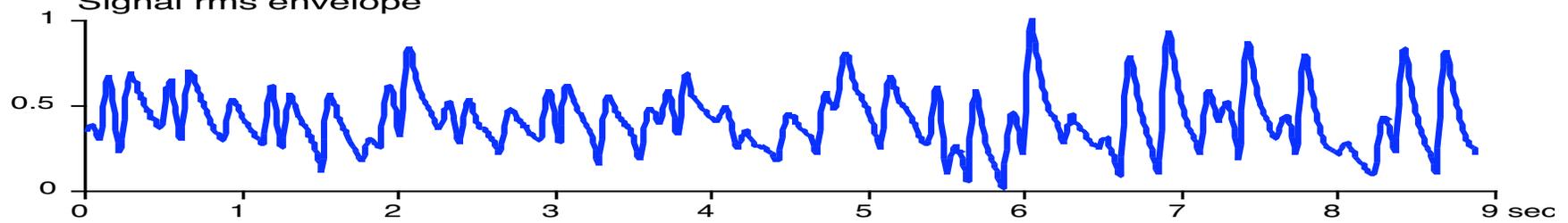
*Journal of New Music Research* 30, no. 2 (2001): 107-135. DOI: 10.1076/jnmr.30.2.107.7115.

This journal is available online at <http://www.ingentaconnect.com/content/routledg/jnmr/>

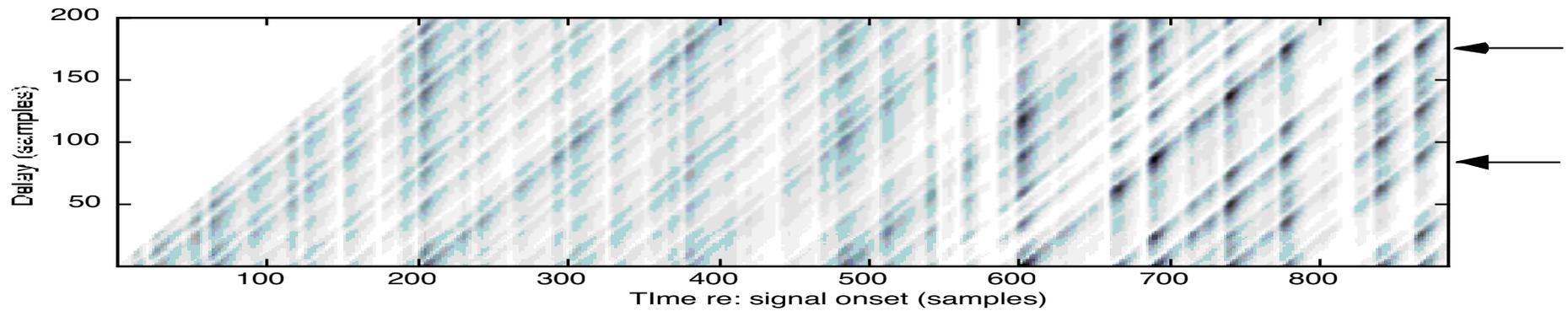
Fragment from G. Ligeti's *Musica Ricercata*



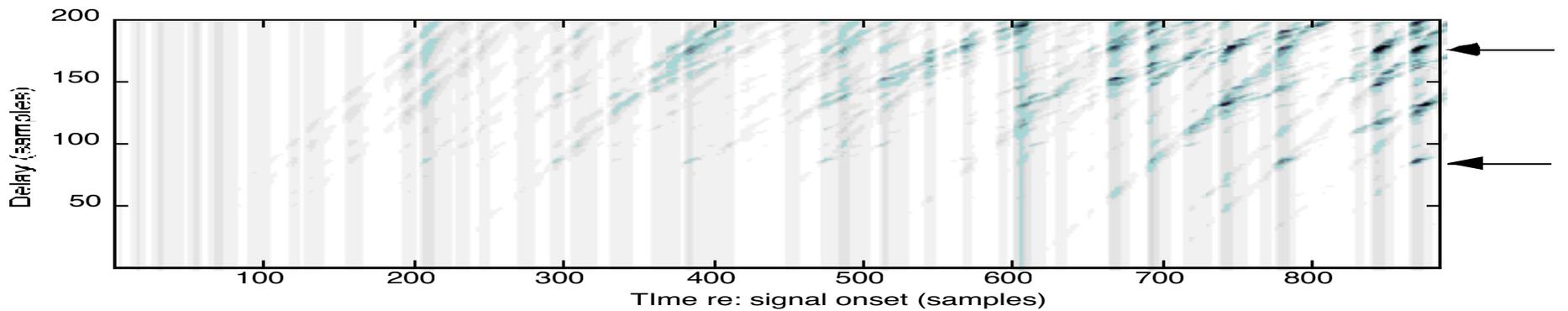
Signal rms envelope



Autocorrelogram



Recurrent timing net

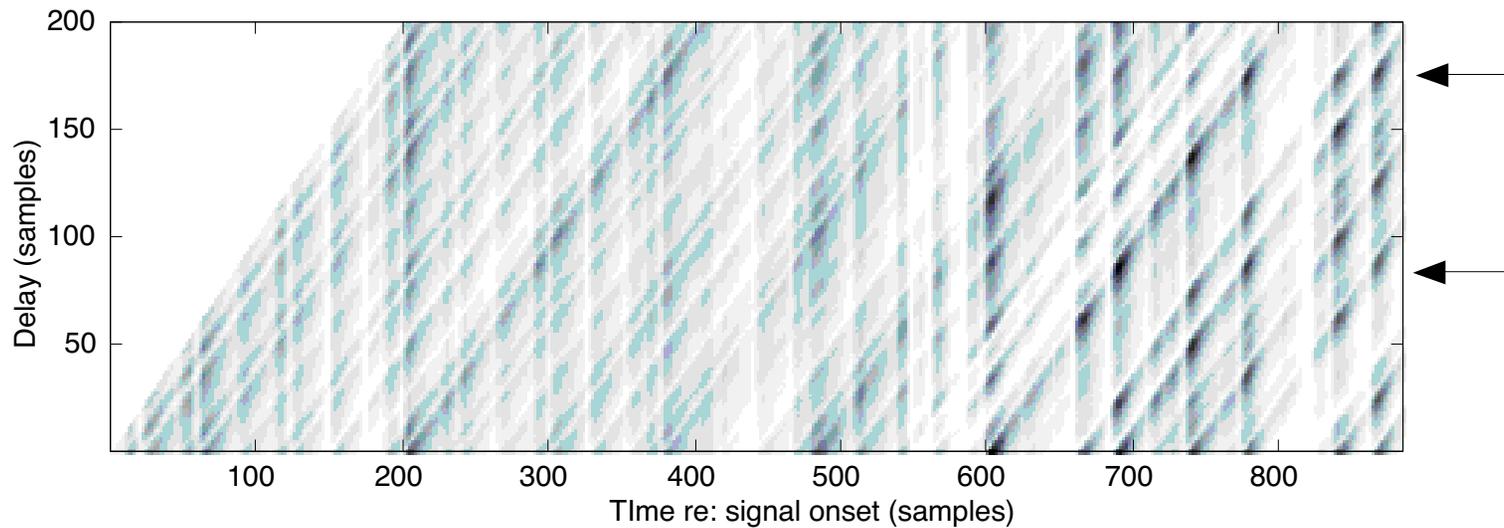


This image is from the article Cariani, P. "Temporal Codes, Timing Nets, and Music Perception."

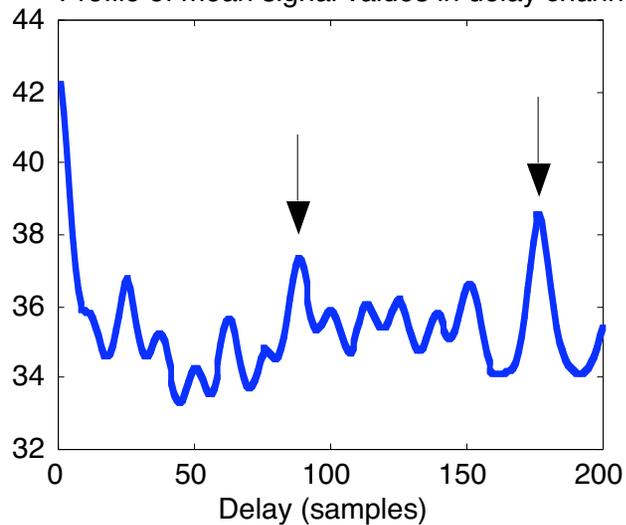
*Journal of New Music Research* 30, no. 2 (2001): 107-135. DOI: 10.1076/jnmr.30.2.107.7115.

This journal is available online at <http://www.ingentaconnect.com/content/routledg/jnmr/>

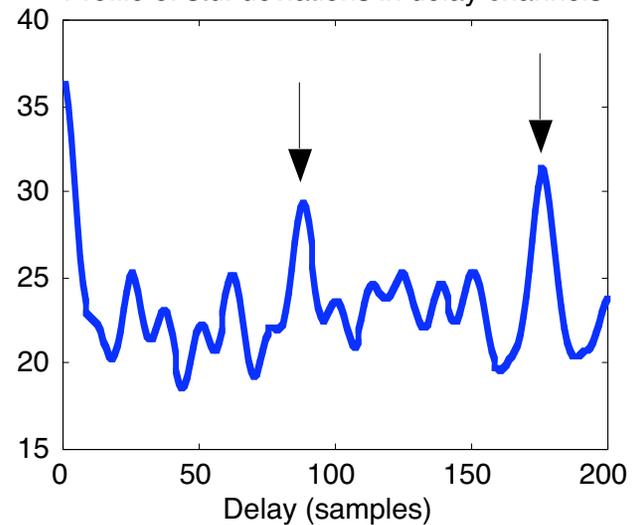
## Autocorrelogram



### Profile of mean signal values in delay channels

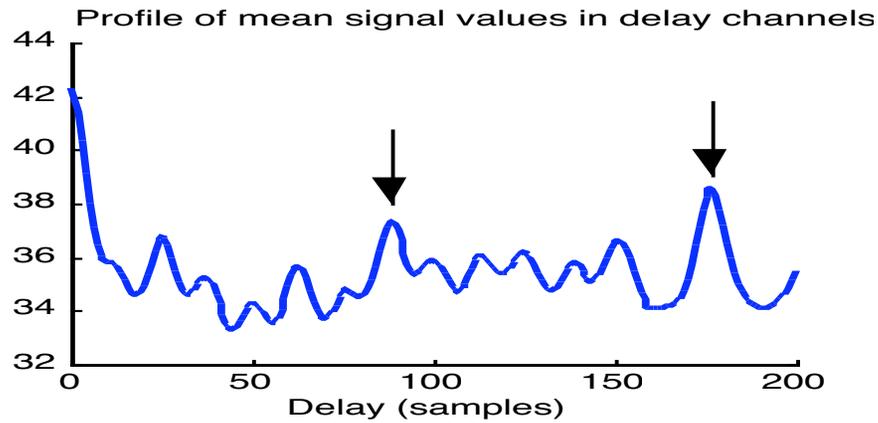


### Profile of std. deviations in delay channels

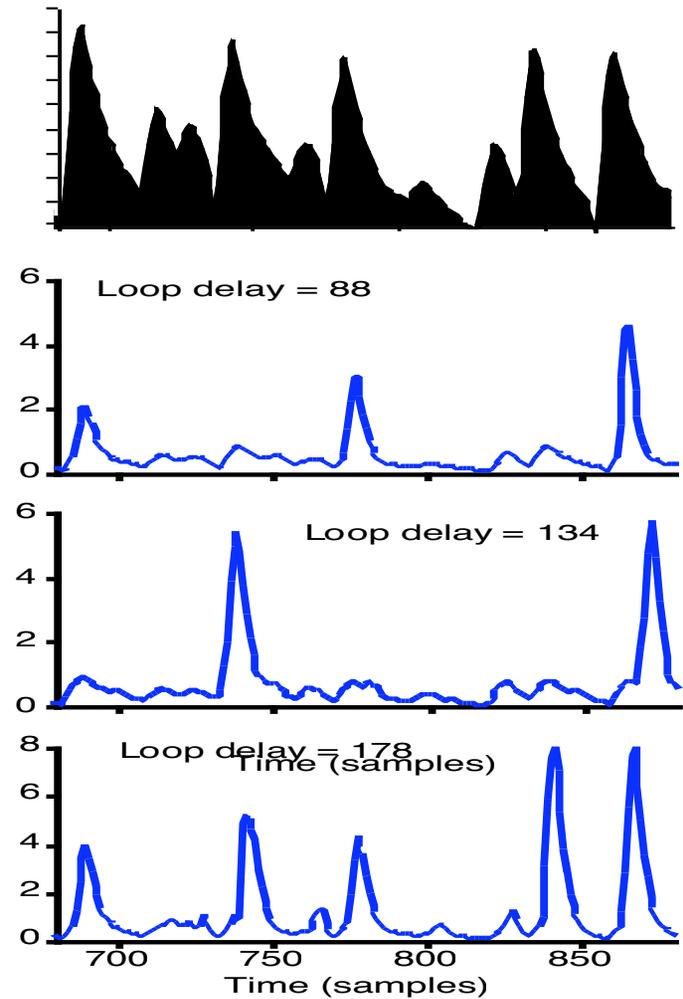


This image is from the article Cariani, P. "Temporal Codes, Timing Nets, and Music Perception." *Journal of New Music Research* 30, no. 2 (2001): 107-135. DOI: 10.1076/jnmr.30.2.107.7115. This journal is available online at <http://www.ingentaconnect.com/content/routledg/jnmr/>

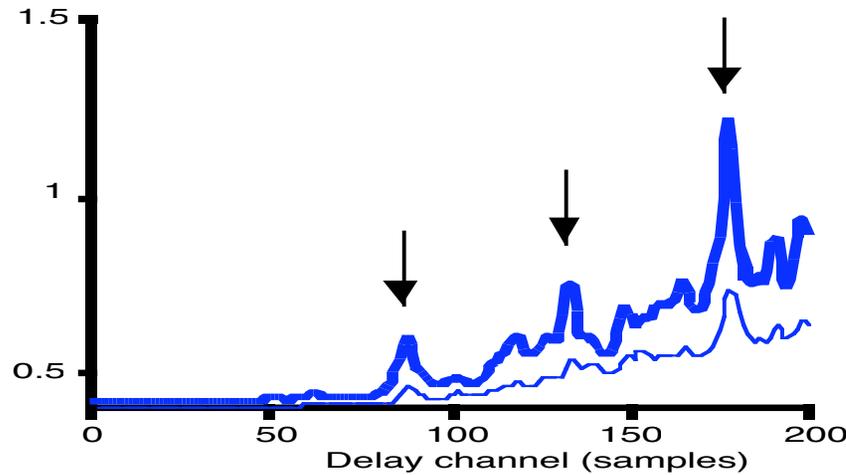
### Autocorrelogram



### Ligeti envelope (fragment end)



### Recurrent timing net



Response of a recurrent timing network to the Ligeti fragment.  $H(j, t) = \max(X(t-1, j), X(t-1, j) * H(j, t-1) * (1 + j/100))$  where  $X$  is the in envelope of the Ligeti fragment, and  $H$  is the value of the signal in delay loop  $j$  (first index) at time  $t$  (second index). The buildup factor  $(1 + j/100)$  depends on the duration of the delay loop (i.e. equal to  $j$  samples). The mean signal value  $H$  in the delay channels over the last 200 samples (thicker line) and over the whole fragment (thin line) are shown in the top right line plot. The waveforms that are built up in the three most activated delay loops are shown above. The results, not surprisingly resemble those obtained with the running autocorrelation. The sampling rate of the signal was approximately 10 Hz.

This image is from the article Cariani, P. "Temporal Codes, Timing Nets, and Music Perception."

*Journal of New Music Research* 30, no. 2 (2001): 107-135. DOI: 10.1076/jnmr.30.2.107.7115.

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