

COMP 546

Lecture 22

Spectrograms (revisited),  
Auditory filters

Thurs. April 5, 2018

# Spectrogram

Partition a sound signal into  $B$  blocks of  $T$  samples each (i.e. the sound has  $BT$  samples in total).



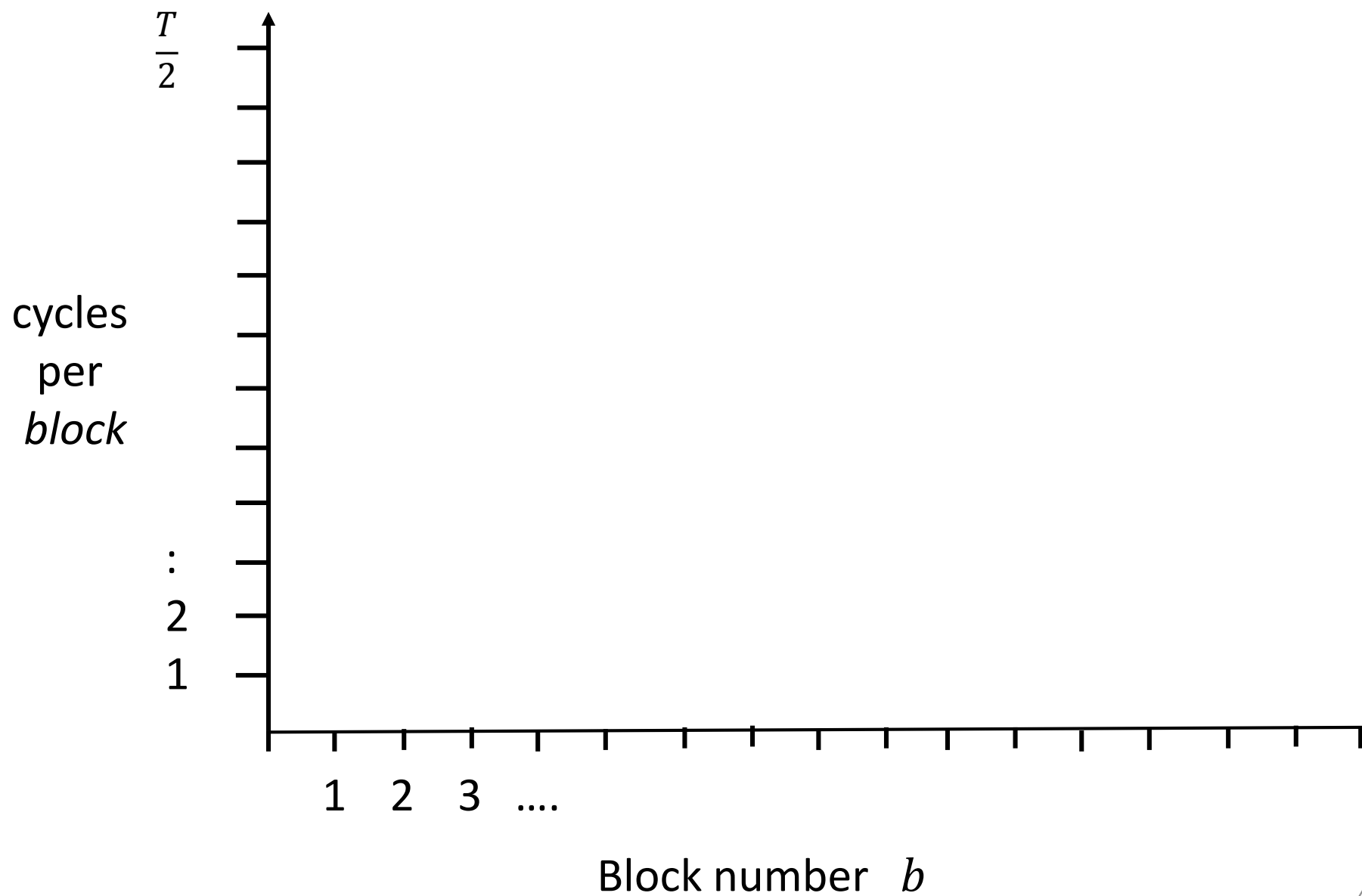
# Spectrogram

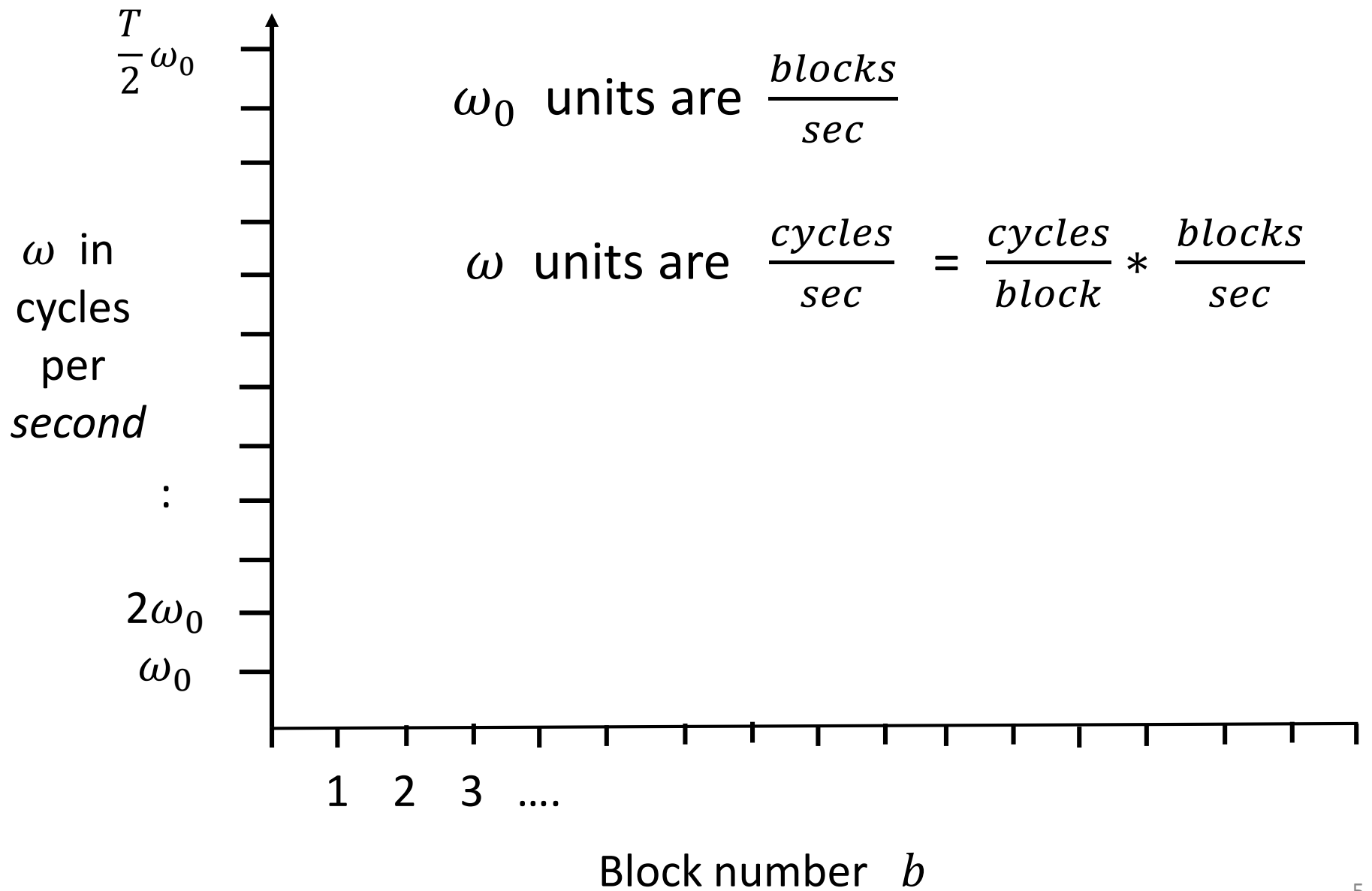
Partition a sound signal into  $B$  blocks of  $T$  samples each (i.e. the sound has  $BT$  samples in total).

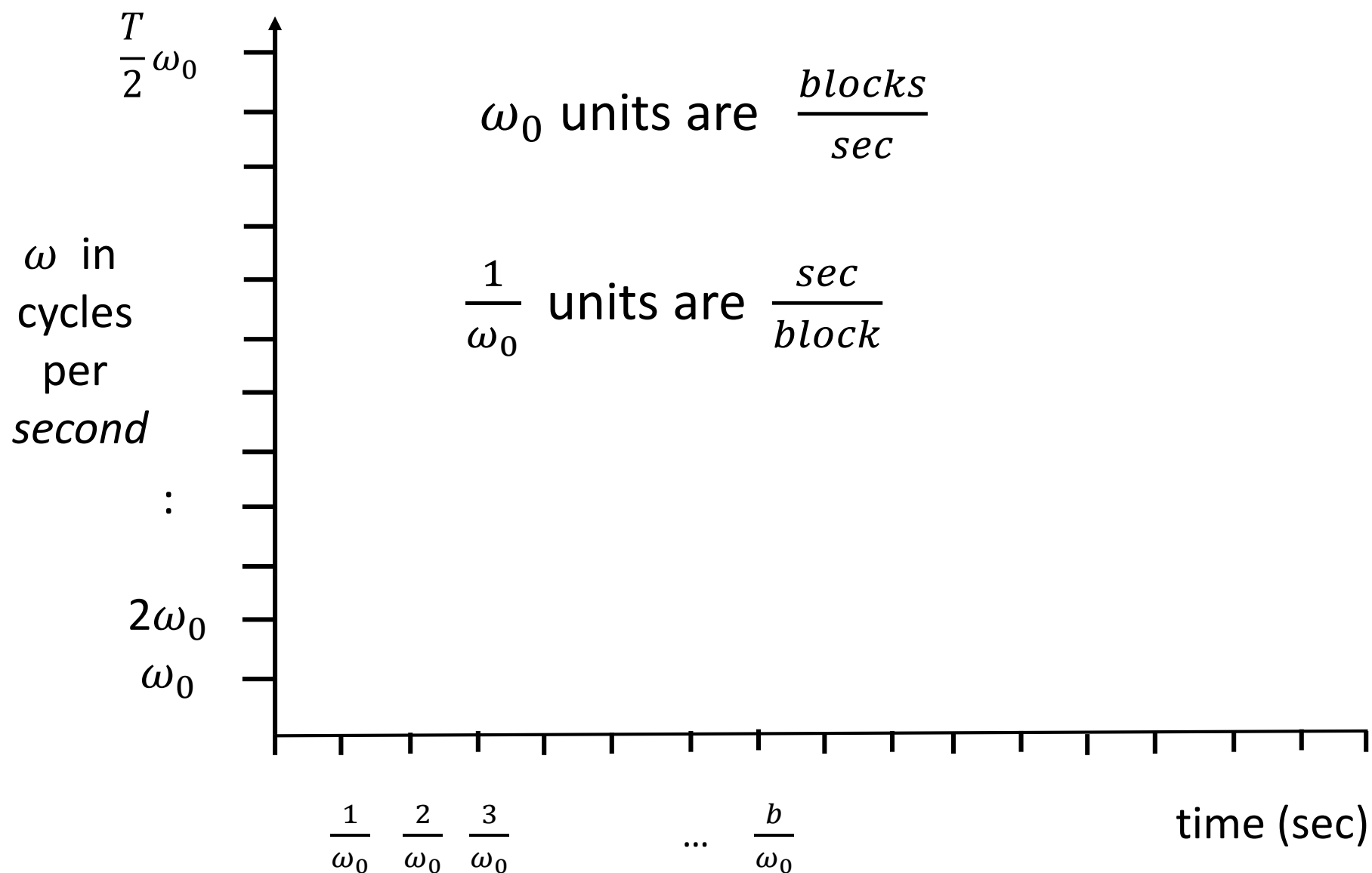
Take the Fourier transform of each block.

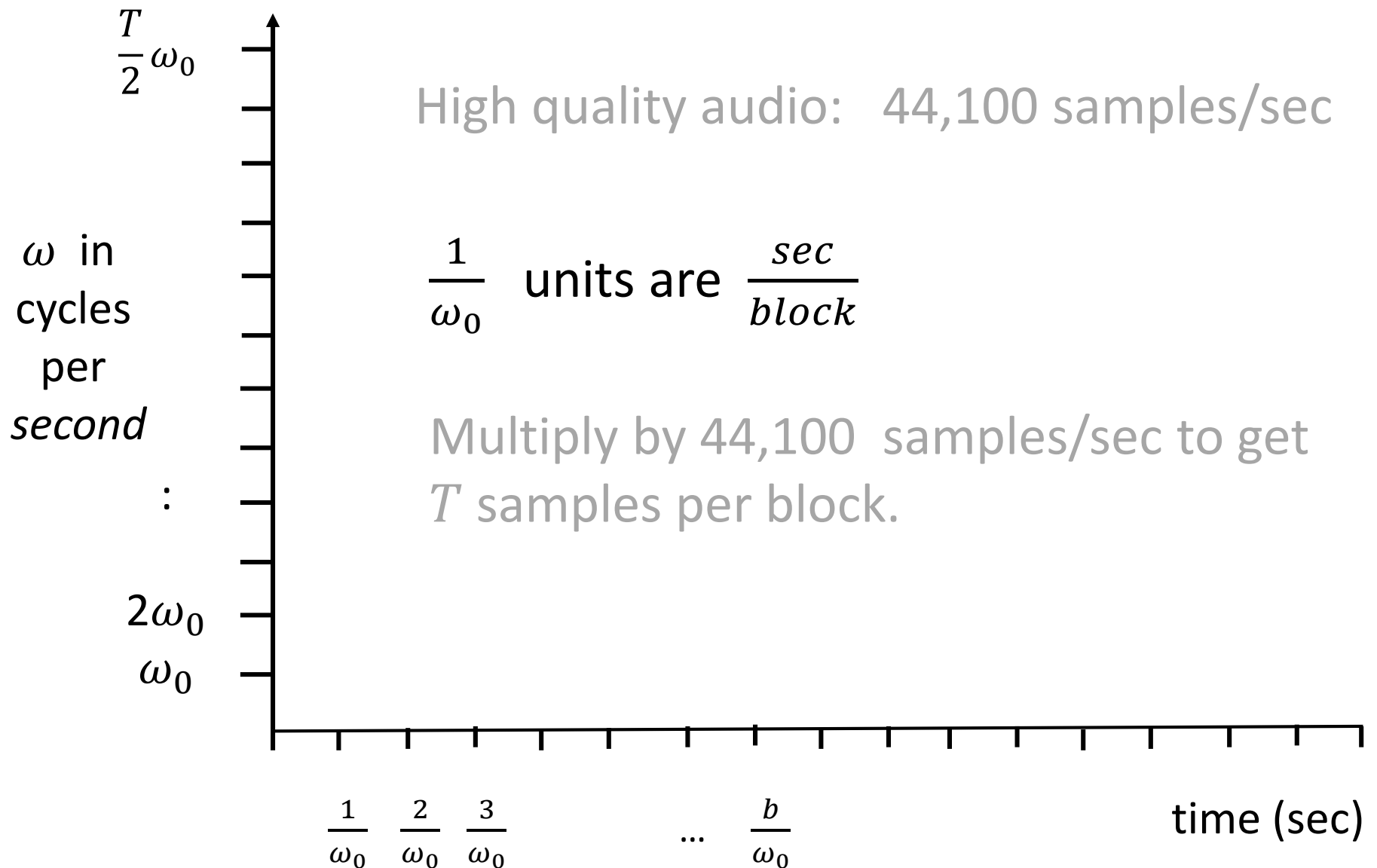
Let  $b$  be the block number, and  $\omega$  units be cycles per block.  
[I will convert  $\omega$  to cycles per second a few slides from now.]

$$\hat{I}(b, \omega) = \sum_{t=0}^{T-1} I(bT + t) e^{-i \frac{2\pi}{T} \omega t}$$

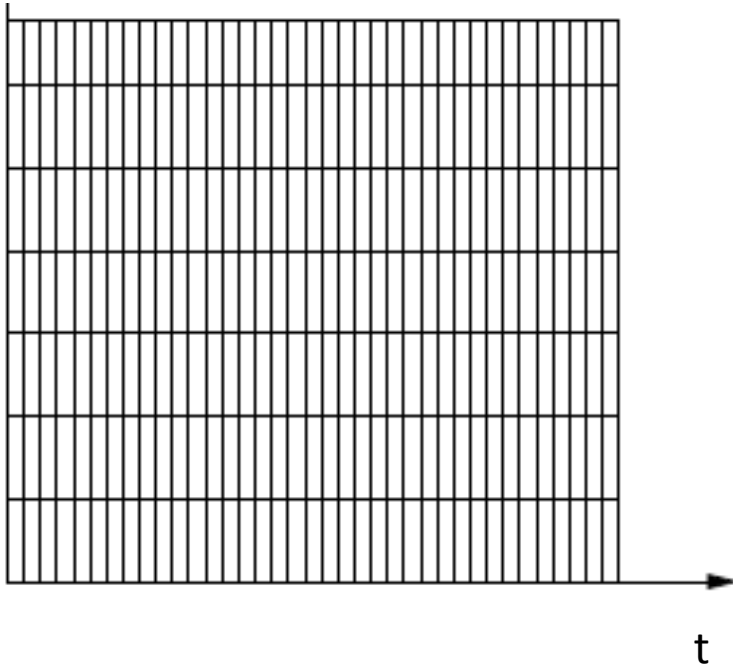






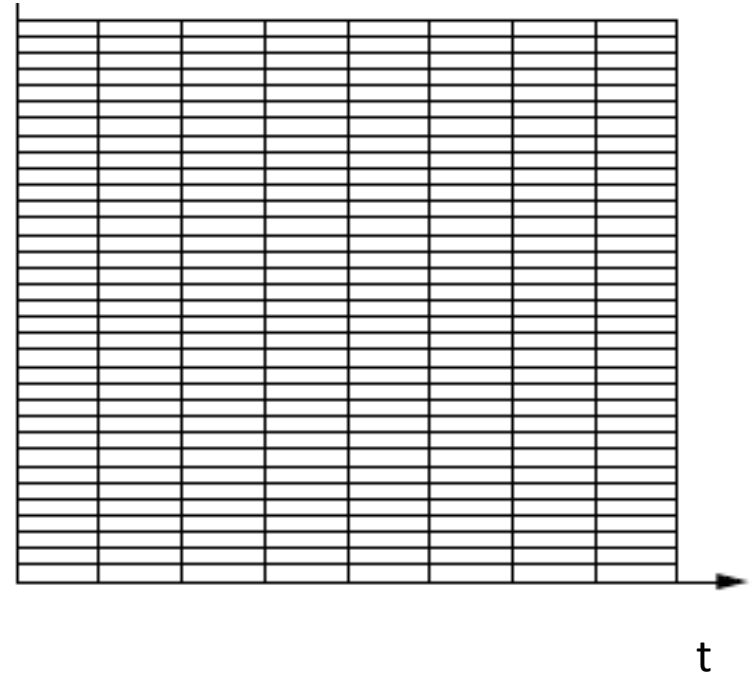


①



T smaller

②



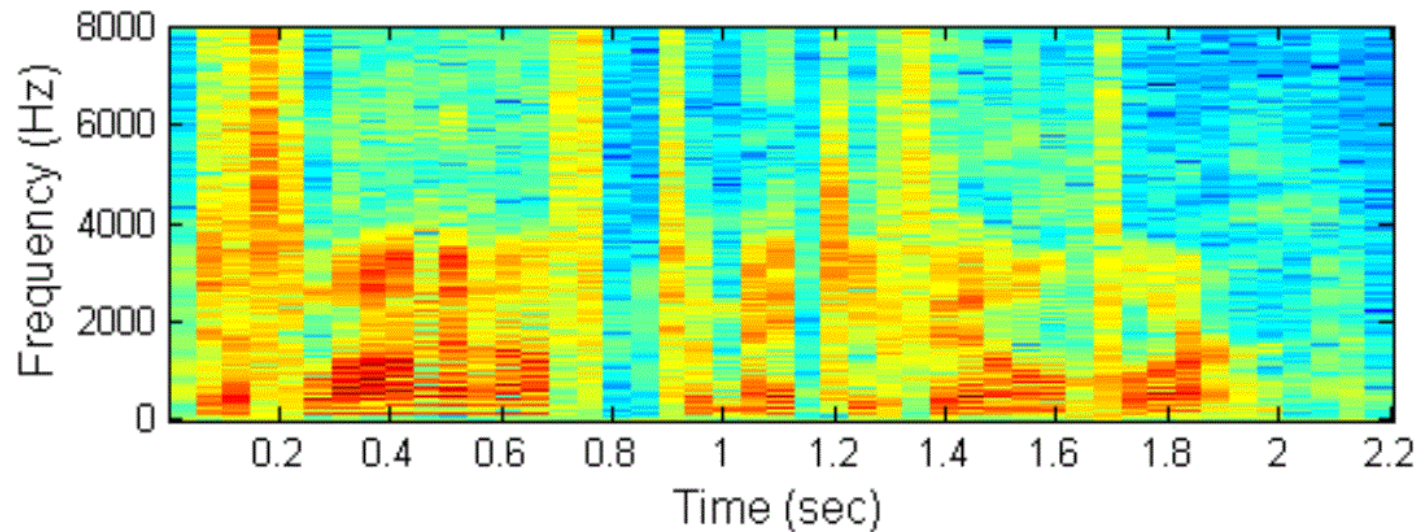
T larger

e.g.  $T = 512$  samples (12 ms),  $\omega_0 = 86$  Hz

$T = 2048$  samples (48 ms),  $\omega_0 = 21$  Hz

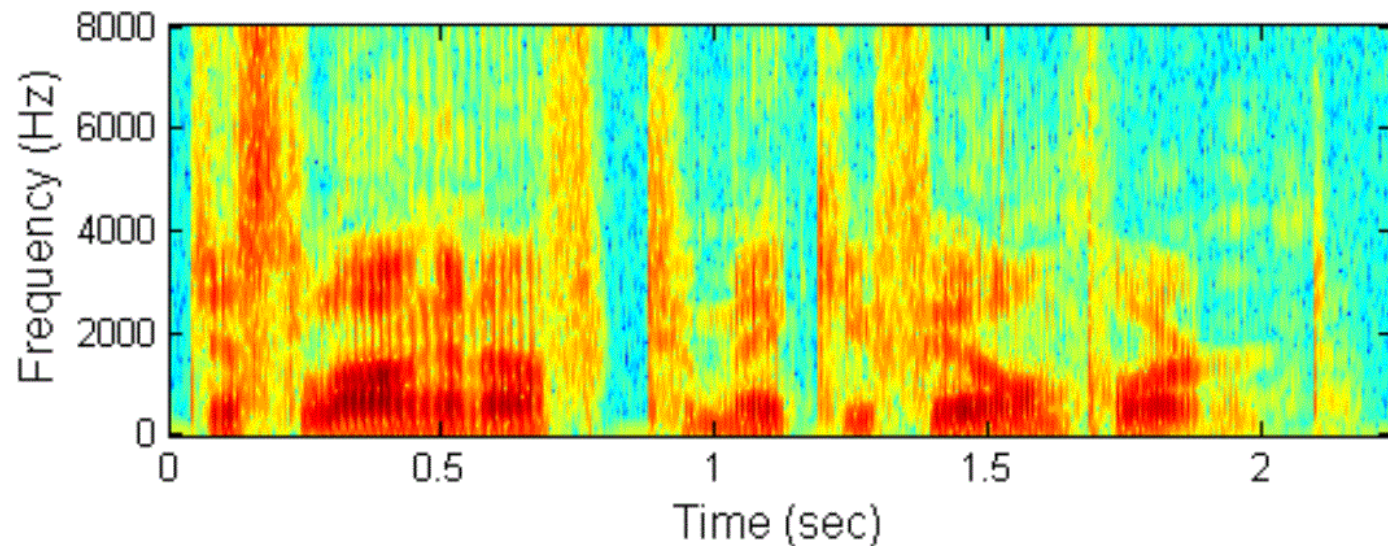
You cannot have high precision of both frequency and time.





## Narrowband

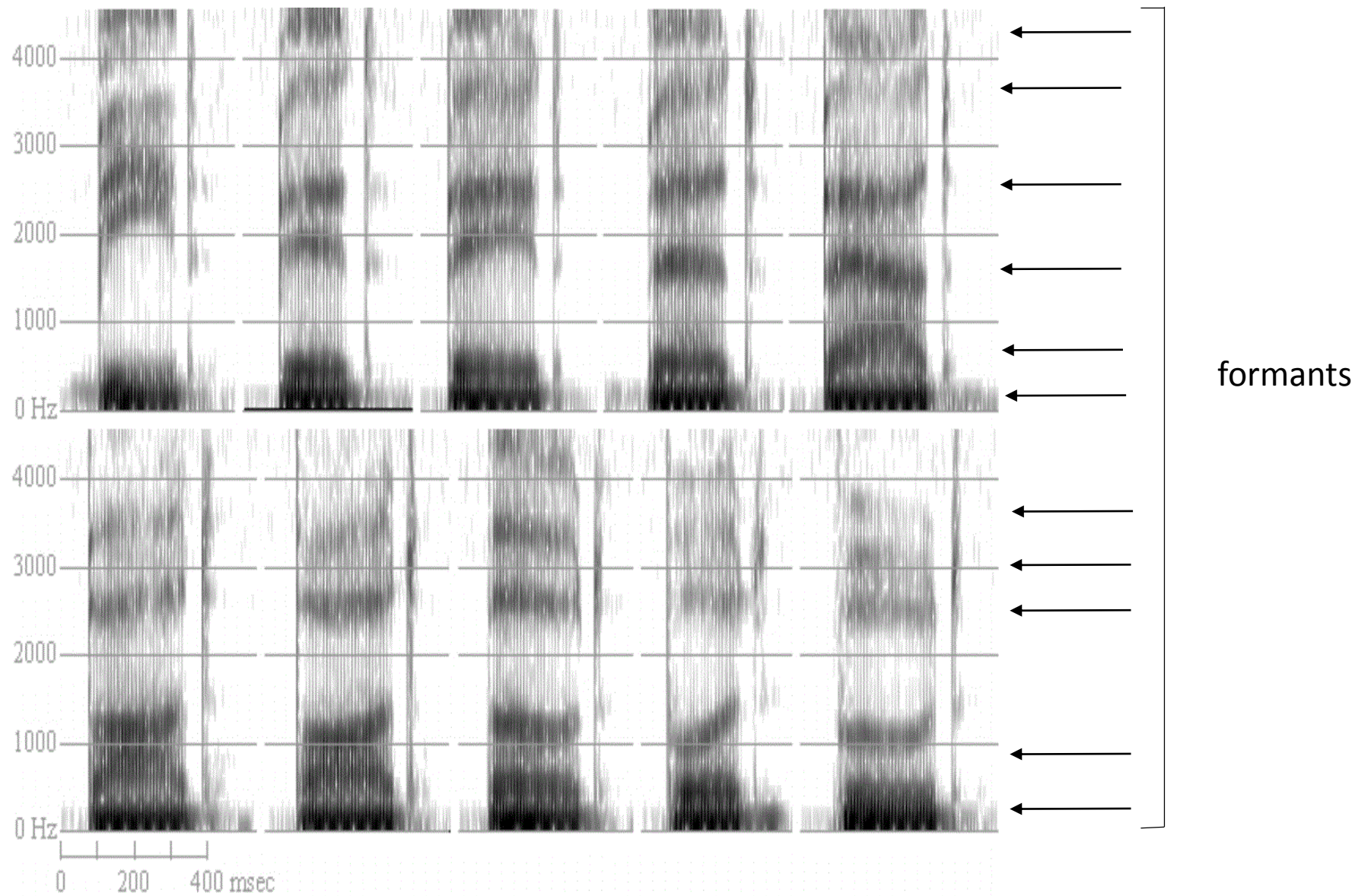
(good frequency resolution,  
poor temporal resolution ...  $\sim 48\text{ms}$ )



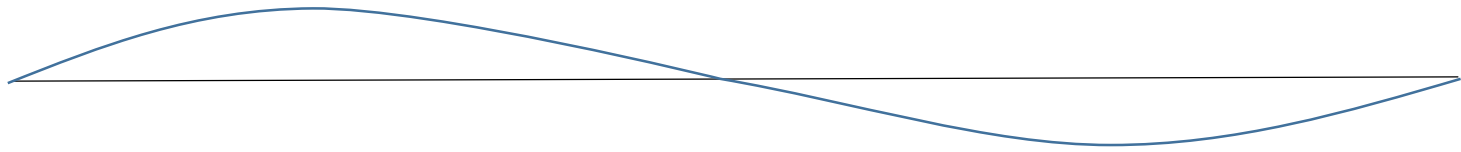
## Wideband

(poor frequency resolution,  
good temporal resolution ...  $\sim 12\text{ ms}$ )

## Example: Wideband spectrograms of 10 vowel sounds



Spectrogram time scales capture auditory events in the world (e.g. parts of speech, impacts, ...) at relatively large time scales.



e.g. period of 12 ms,  $\omega_0 = 86$  Hz,  $\lambda \sim 4$  meters

These low frequencies play little role in spatial hearing (last lecture).

What are the impulse response  
functions of auditory filters?  
(durations, bandwidths and  
center frequencies)

# Auditory filters

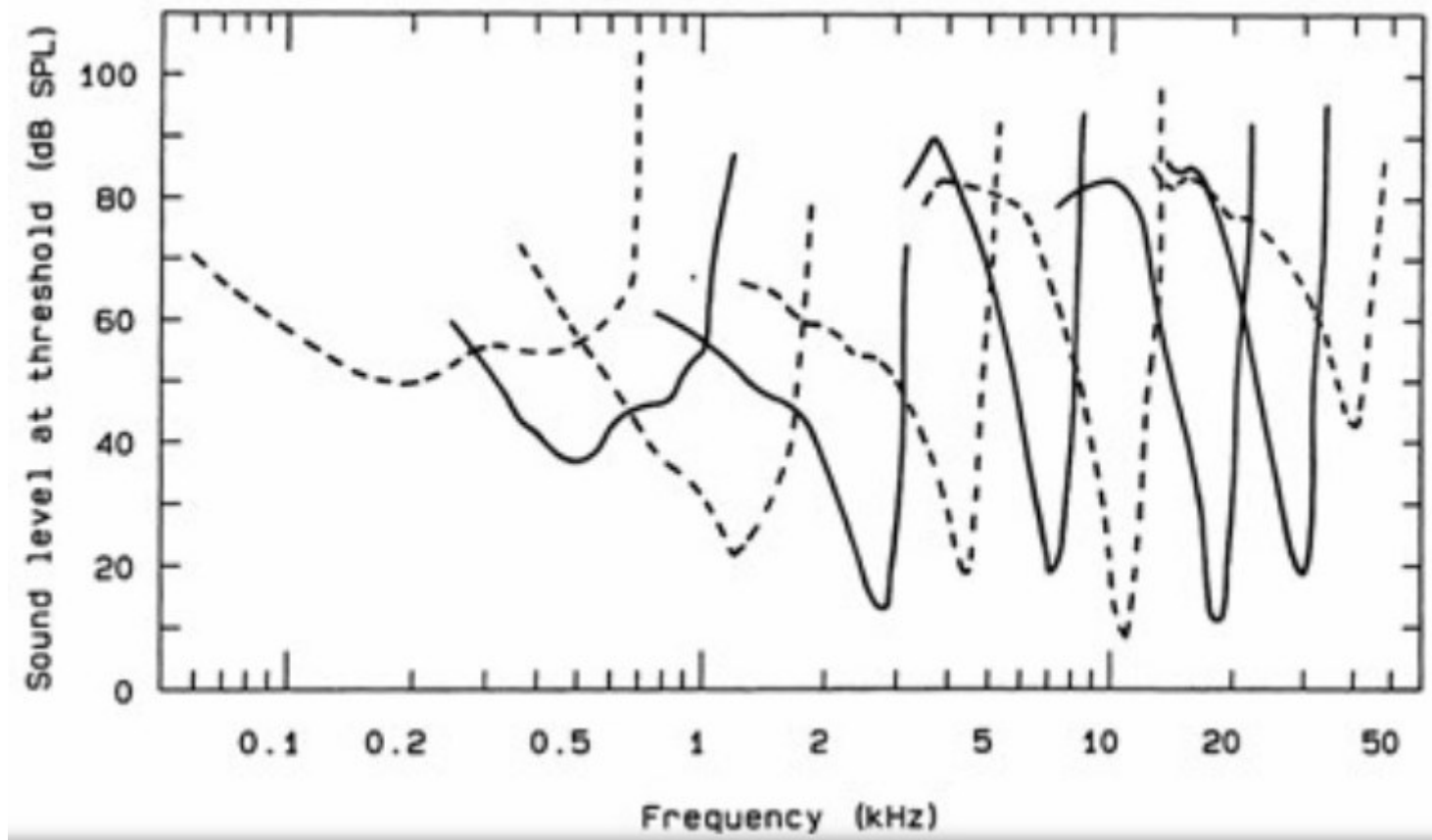
- head related impulse response
- basilar membrane  
<http://www.neurosci.info/courses/systems/Nobels/1961%20von%20Bekesy/bekesy-lecture.pdf>
- hair cells and ganglion cells in cochlea
- brainstem e.g. MSO, LSO
- cortex A1 (later today ... larger time scales)

# Auditory filters

Classical experiments used pure tones and/or noise.  
(starting in 1940's and going for 50 years)

- recording from single cells  
(BM, nerve fibres in cochlear nerve, brainstem)
- psychophysics e.g. masking

Example: Frequency tuning curves (thresholds) for different ganglion cells to pure tone stimuli



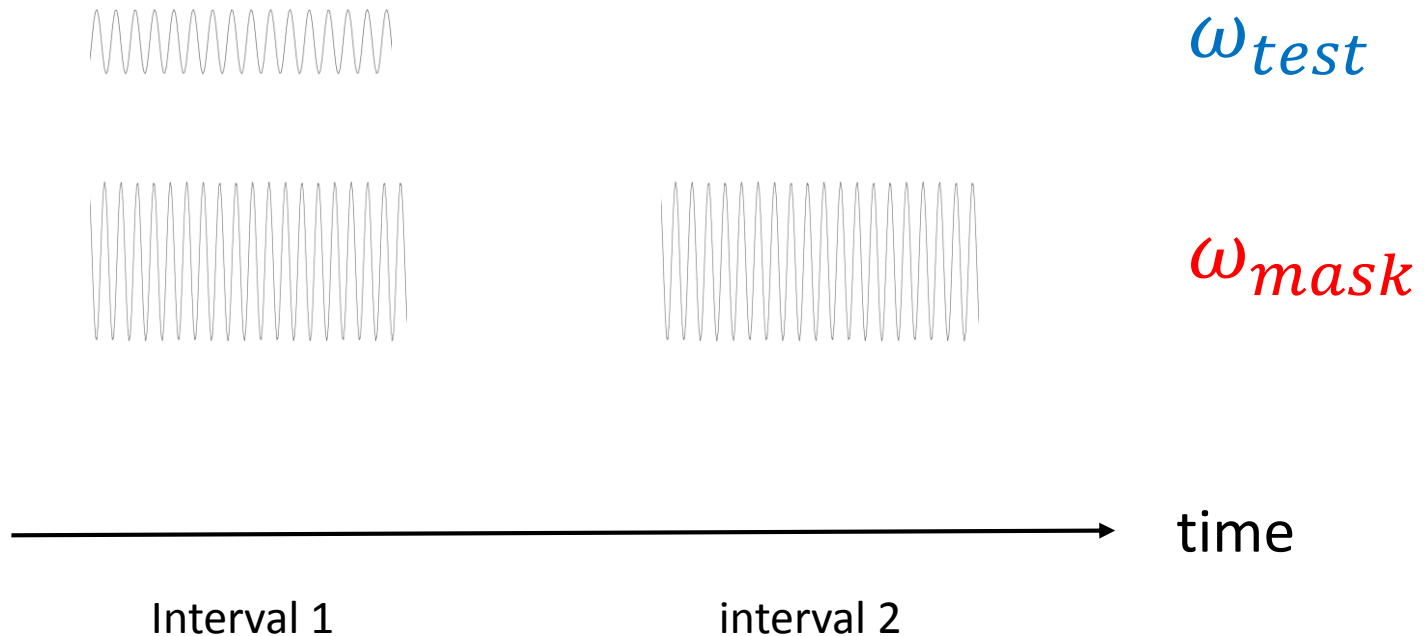
# Psychophysical Masking

How does presence of one frequency component affect our ability to hear other frequency components?

Two similar frequencies mask each other more than two different frequencies.



# Example Masking Experiment



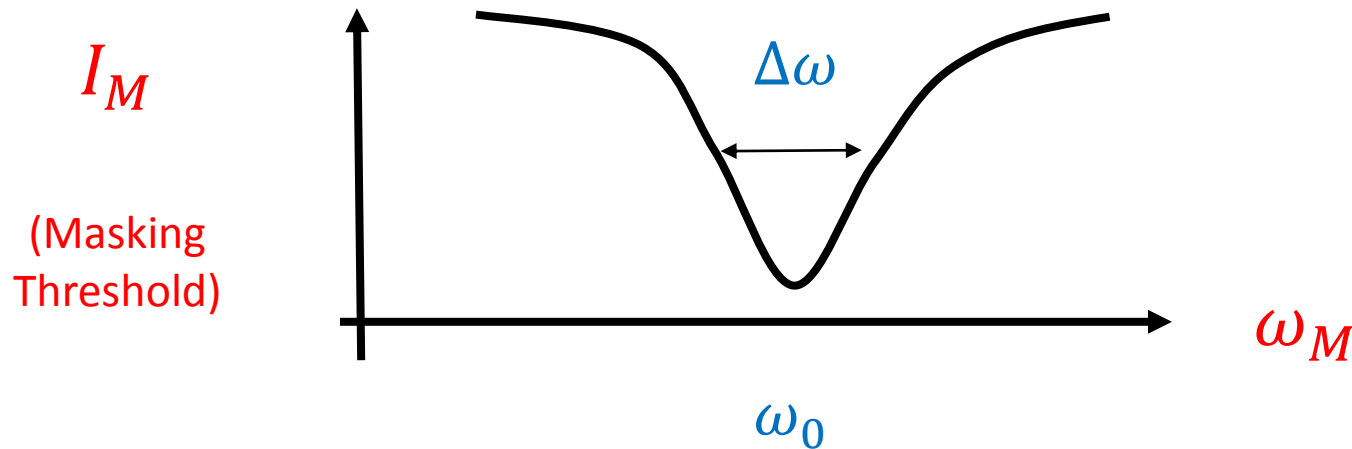
Task: Which interval contains the test tone?

For each **test frequency**  $\omega_0$  with some given SPL,

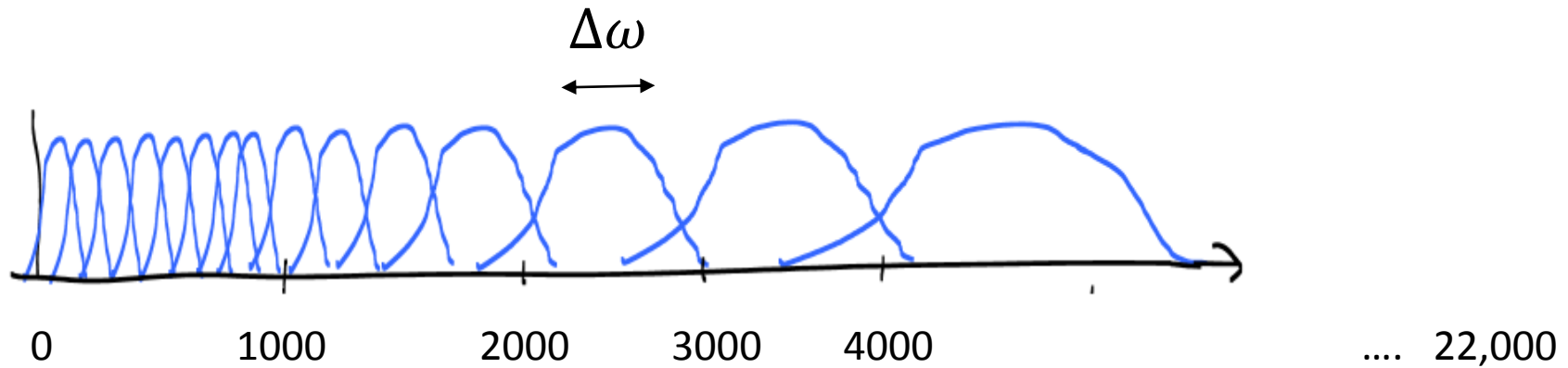
For each masking frequency  $\omega_M$

Measure a **masking threshold**  $I_M(\omega_M)$

Define “*critical bandwidth*” for  $\omega_0$  by  $\Delta\omega$ .



# Auditory filters: typical bandwidth model

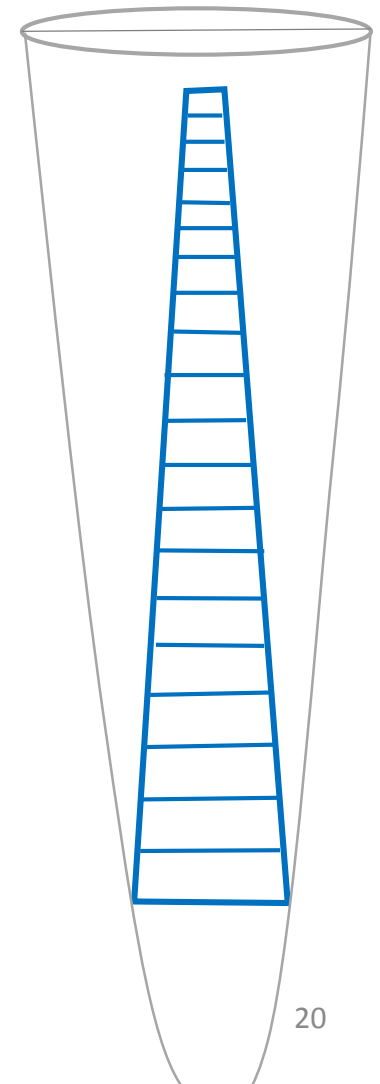
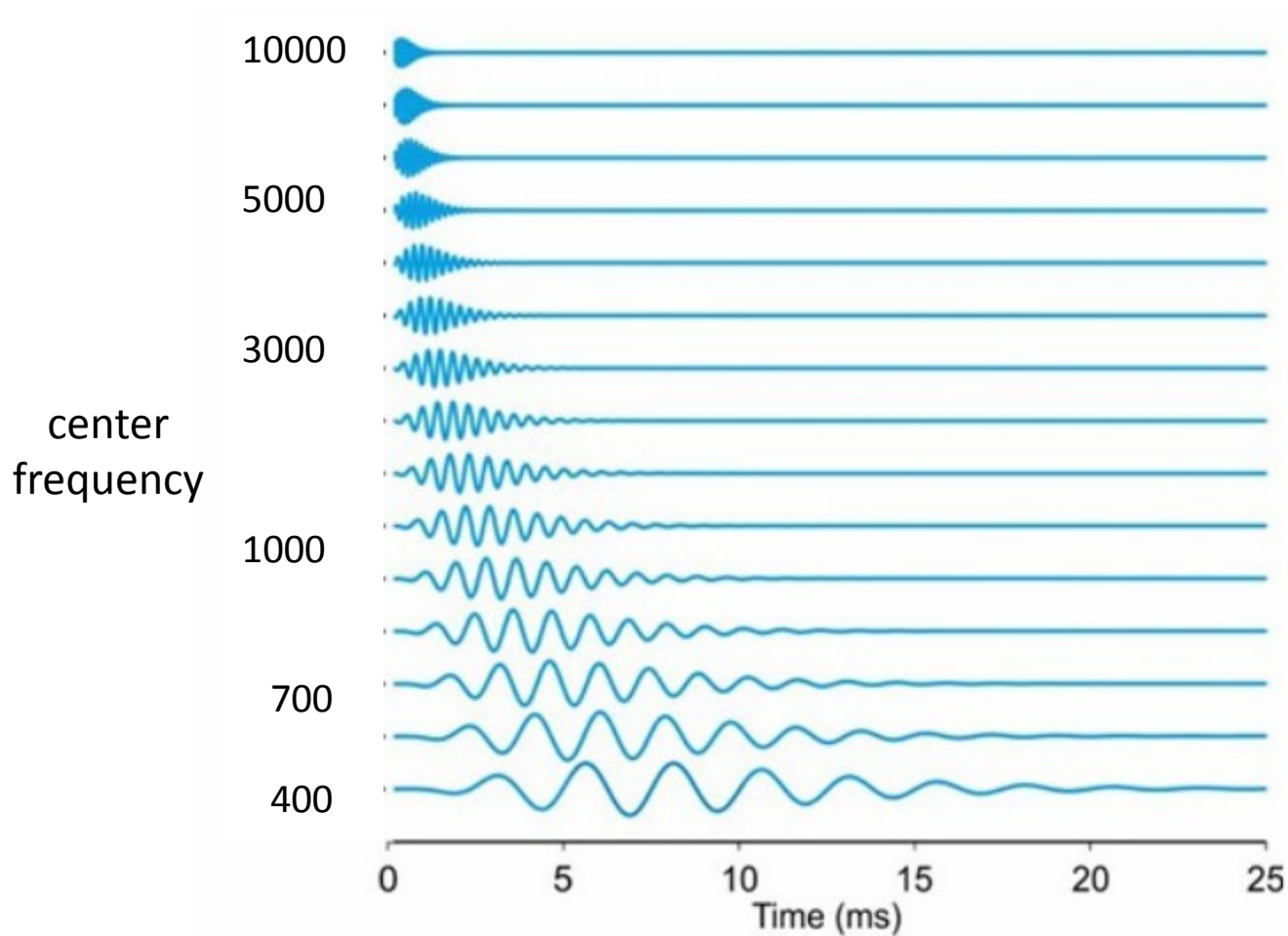


$\Delta\omega$  is  $\sim 100$  Hz for center frequency up to 1000 Hz.

$\Delta\omega$  is  $\sim 1/3$  octave from 1000 Hz up to 22,000 Hz.

# Gammatone filter model

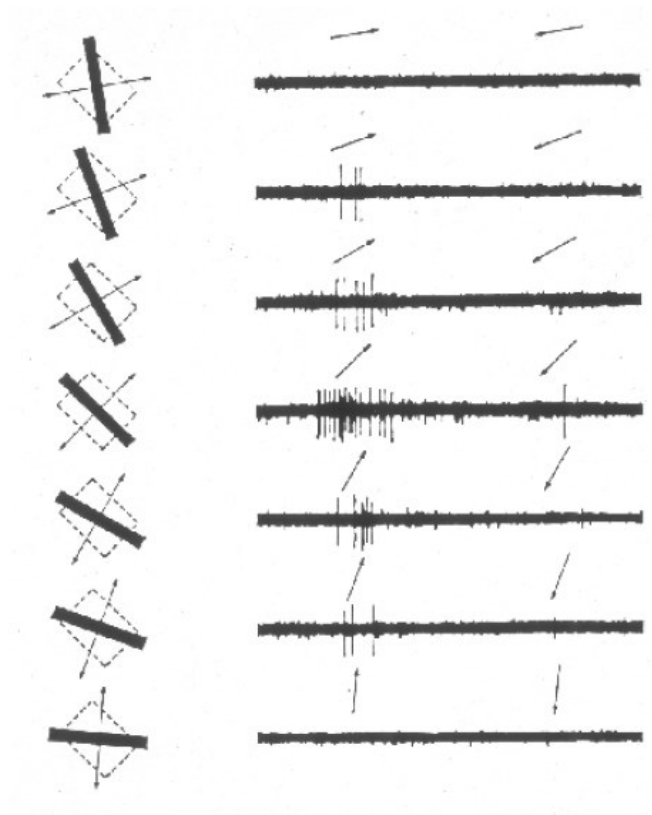
Similar to Gabor filters but window is asymmetric.  
(Also, note shifted in time to enforce *causality*.)



# Auditory filters

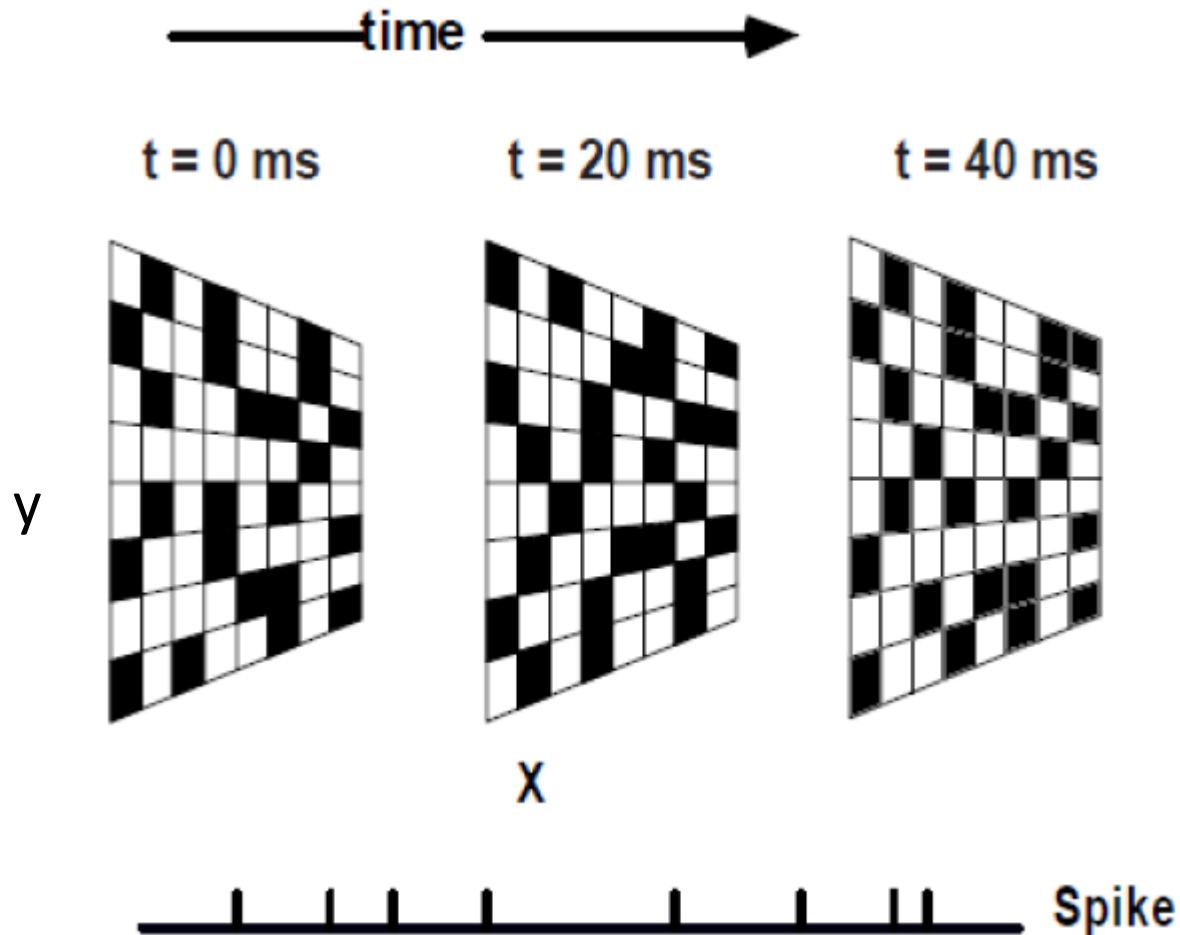
- head related impulse response
- basilar membrane
- hair cells and ganglion cells in cochlea
- brainstem e.g. MSO, LSO
- cortex (A1 and beyond)

# V1: recall Hubel and Wiesel (1962)



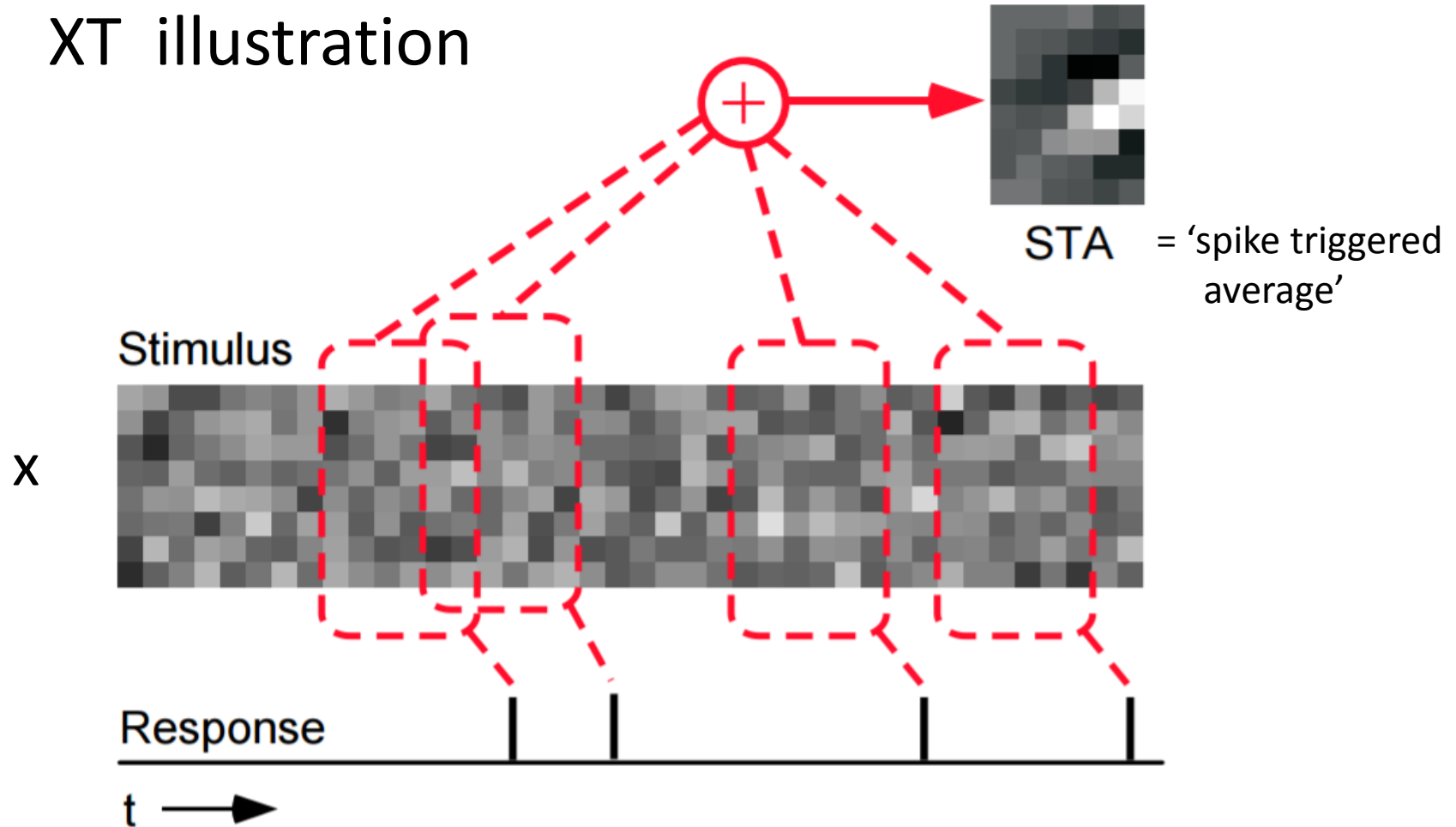
Such a stimulus works well if you *already know* the cell is orientation and motion selective.

Q: What to do if you don't know anything about the receptive field?  
A: Compute "spike triggered average".



Use random input (often white noise). *What is the average spatio-temporal stimulus that preceded the spikes?*

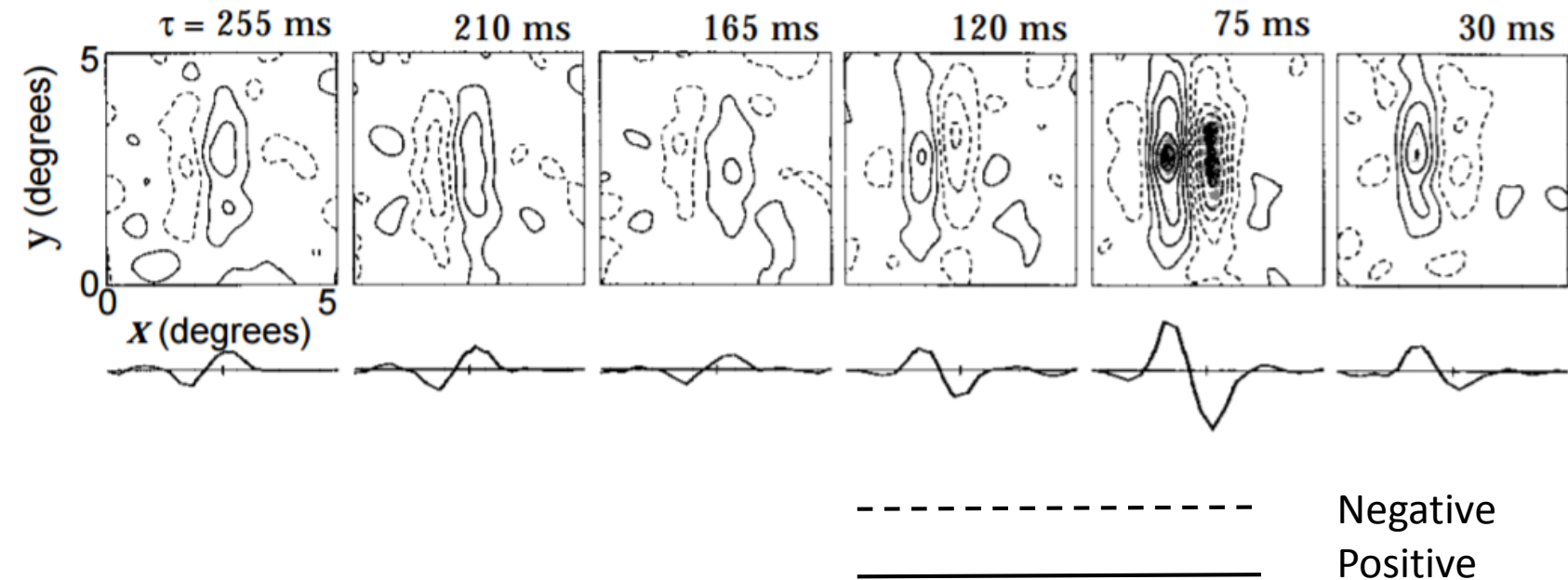
e.g. XT illustration





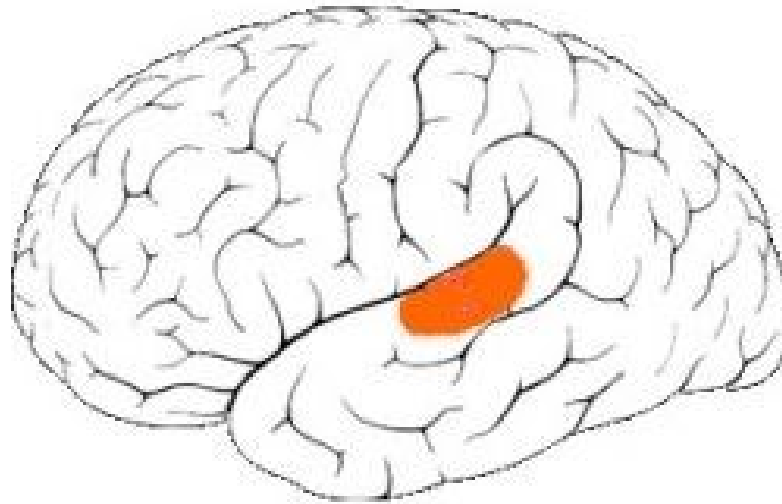
## Real data for V1 receptive field (XYT)

Spike triggered average stimulus (backwards in time). Spike at  $t=0$ .



[DeAngelis 1995]

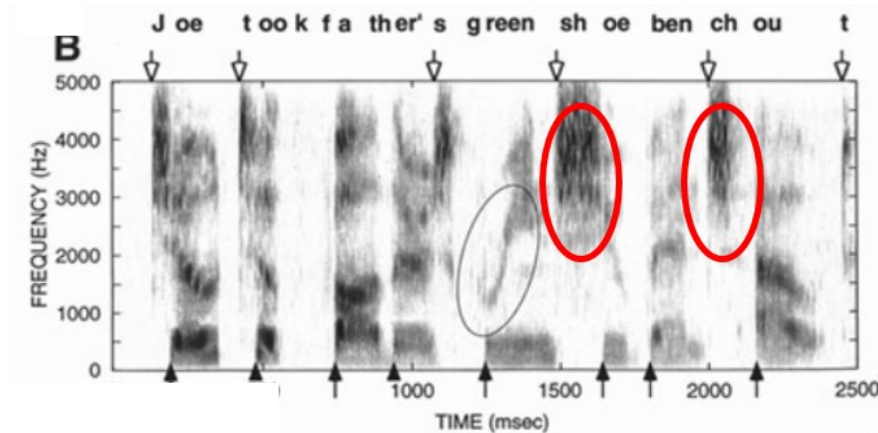
# Auditory Cortex Receptive Fields



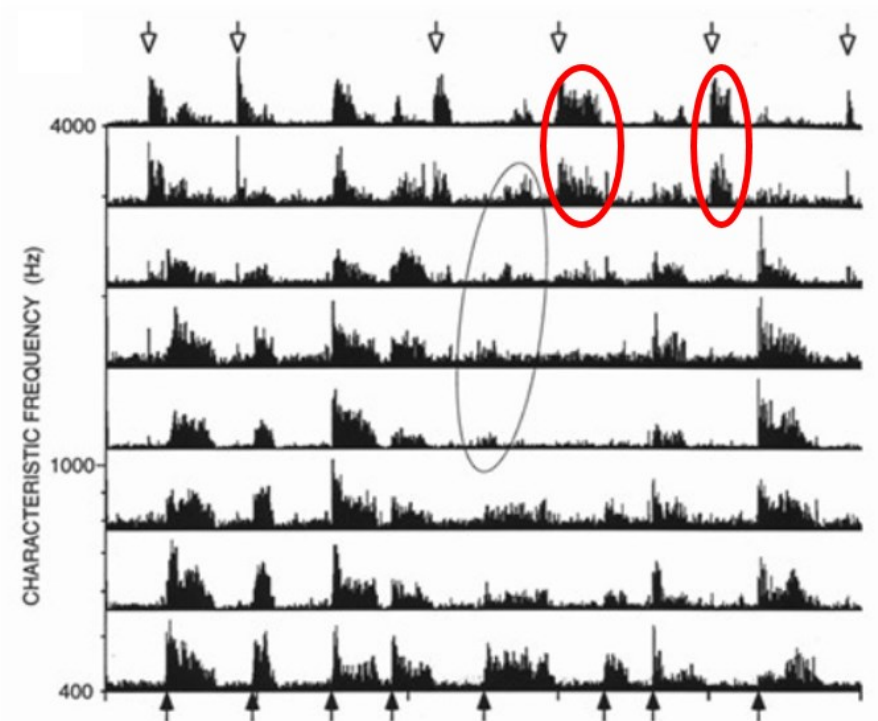
Inputs to A1 and have been spectrally bandpass filtered.

There is ~ no more phase locking to stimulus sound.

# Example of responses of 8 auditory nerve fibres to a voice sound



Spectrogram of voice saying “Joe took father’s green shoe bench out”.



Spike histograms of *auditory nerve* fibres (cat) with different peak (“characteristic”) frequency sensitivities.

[Delgote 1997]

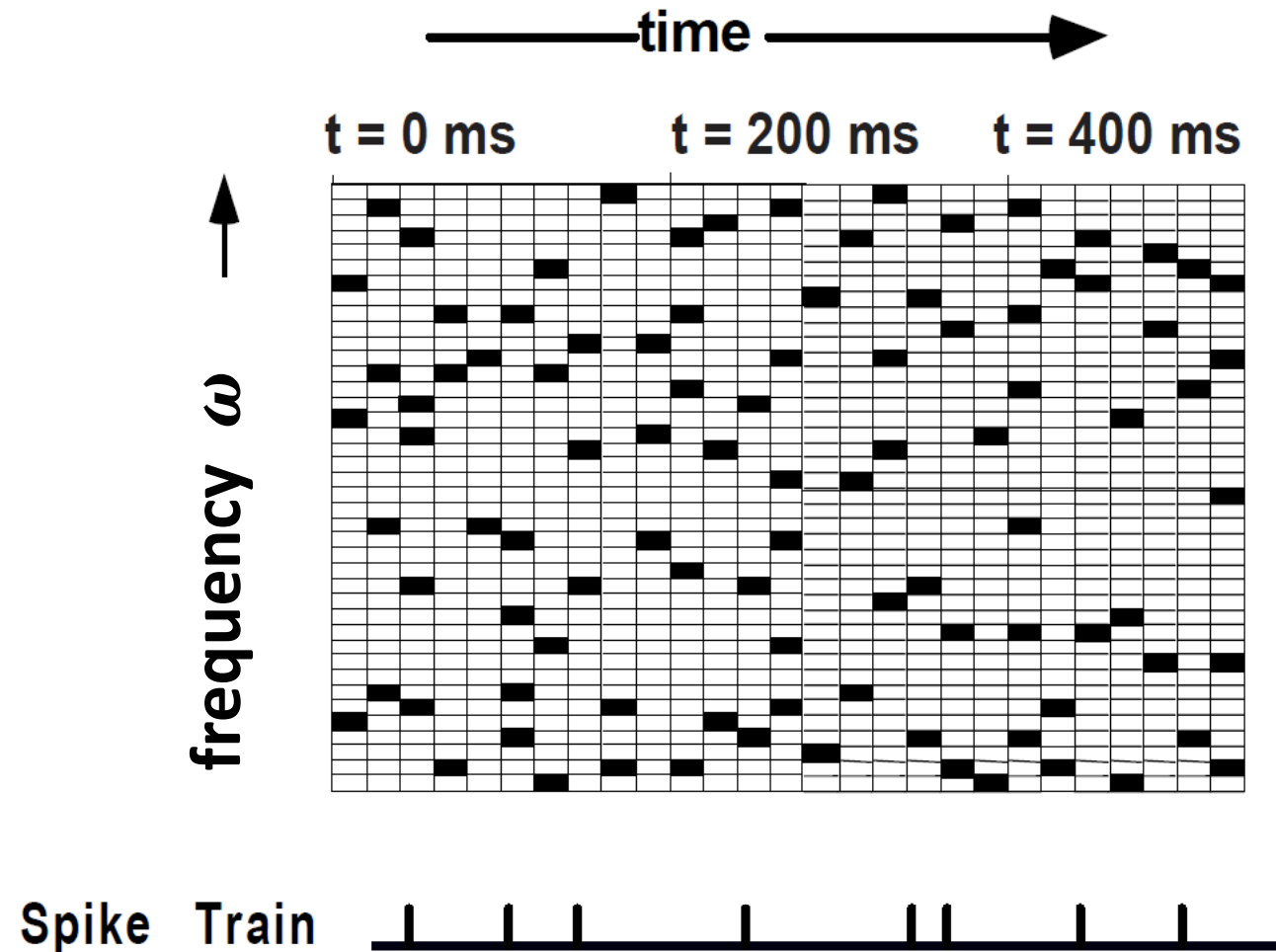
What stimuli to use? (Cats don't understand human speech, so it unlikely we would find cells tuned for it.)

Recall Hubel and Wiesel had first tried using center-surround stimuli for cells in V1.

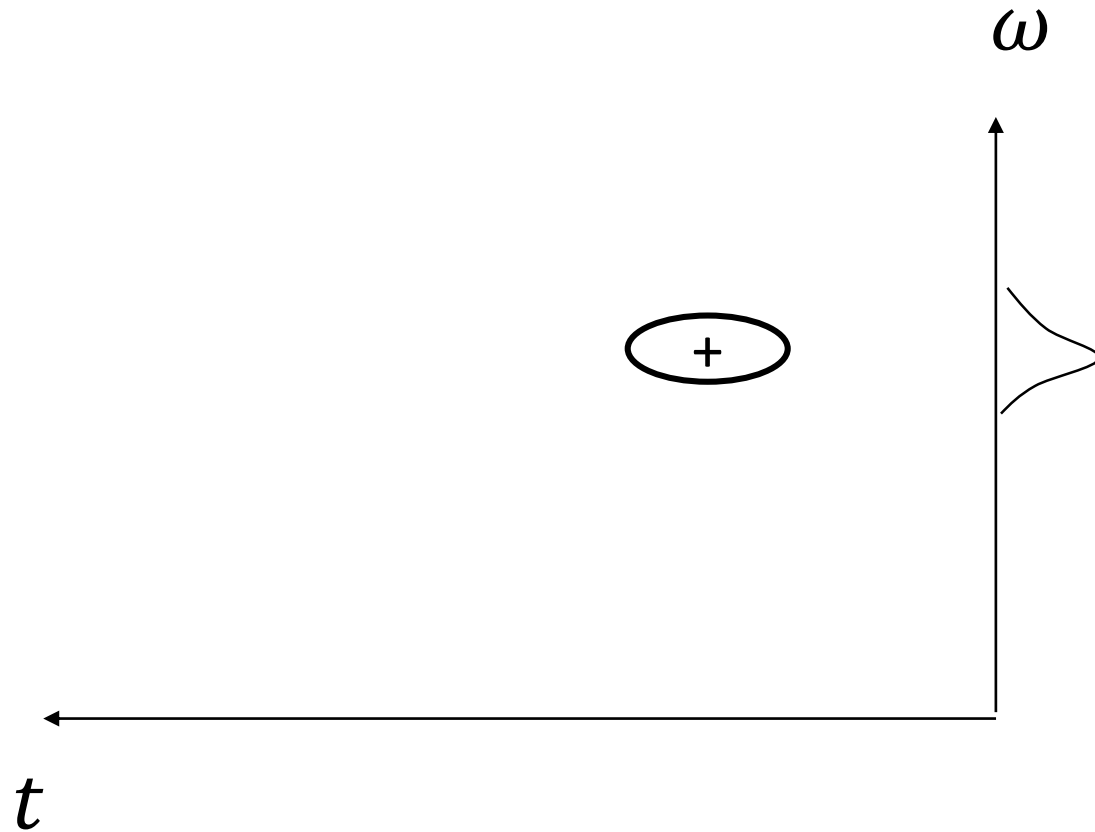
The analogy in audition would be to use the same bandpass stimuli used for auditory fibres.

Any other ideas?

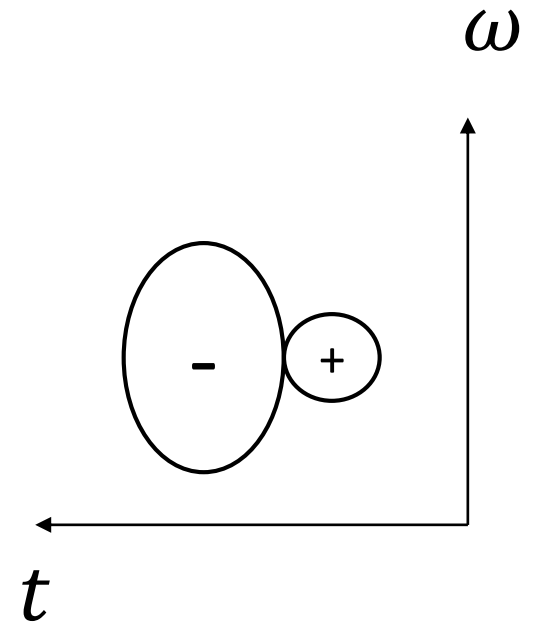
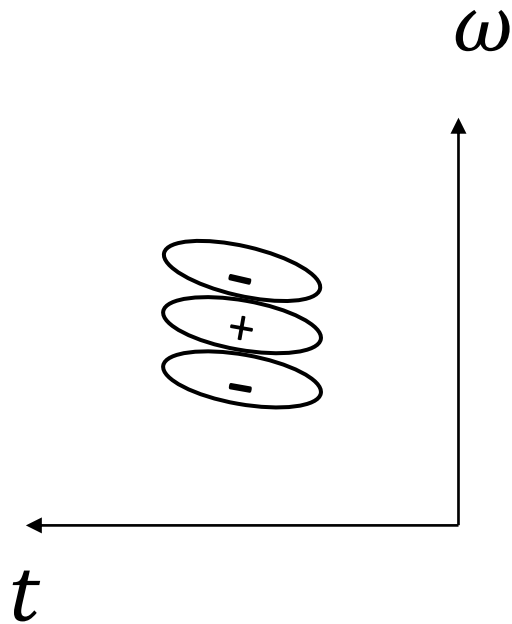
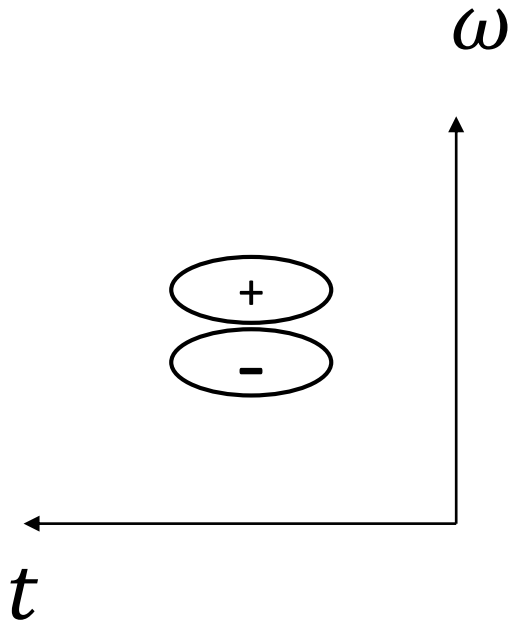
# Random “chord” stimuli [deCharms, 1998]



What spike triggered average should we expect from a bandpass cell ?

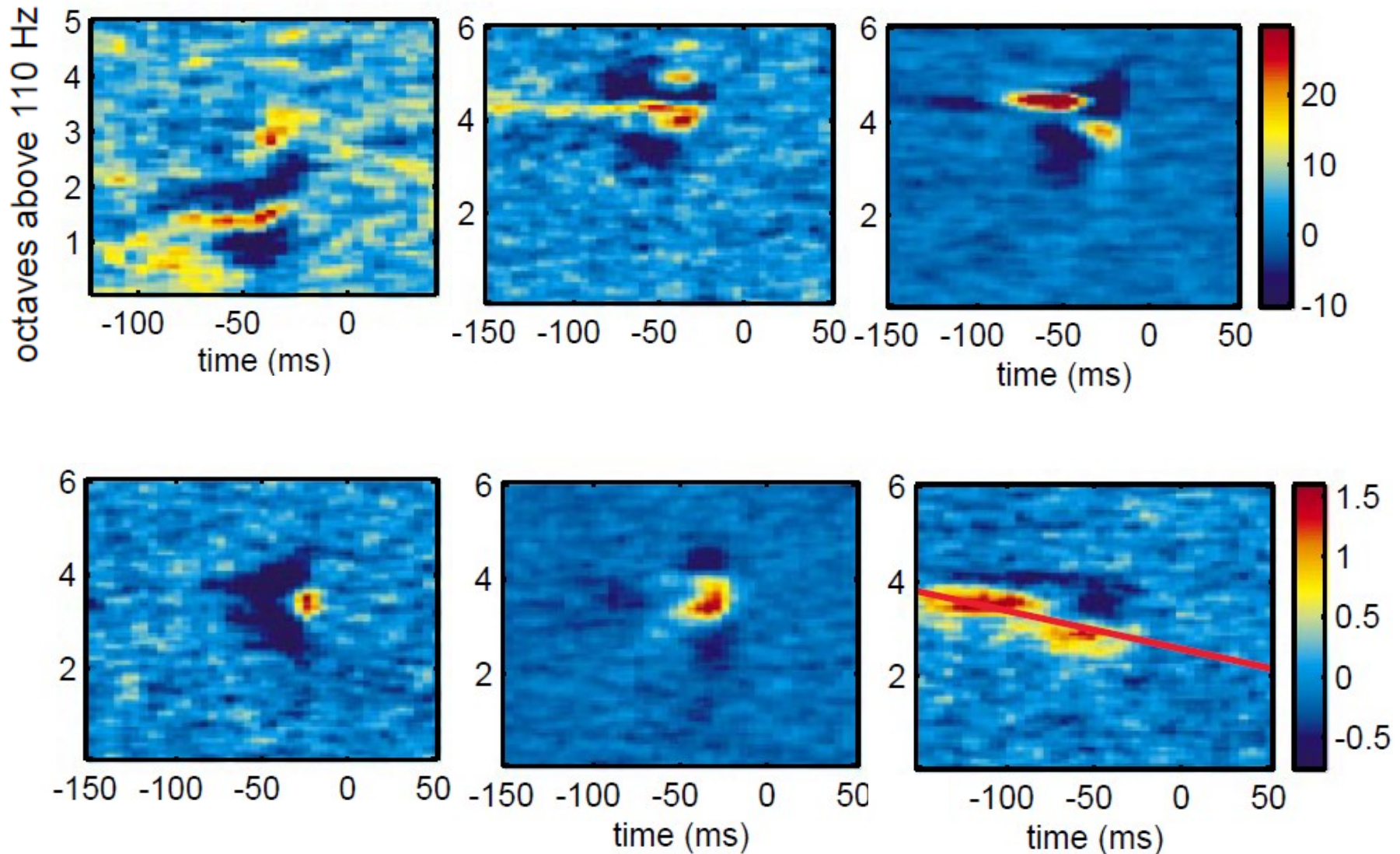


Do we find more interesting cells such as... ?

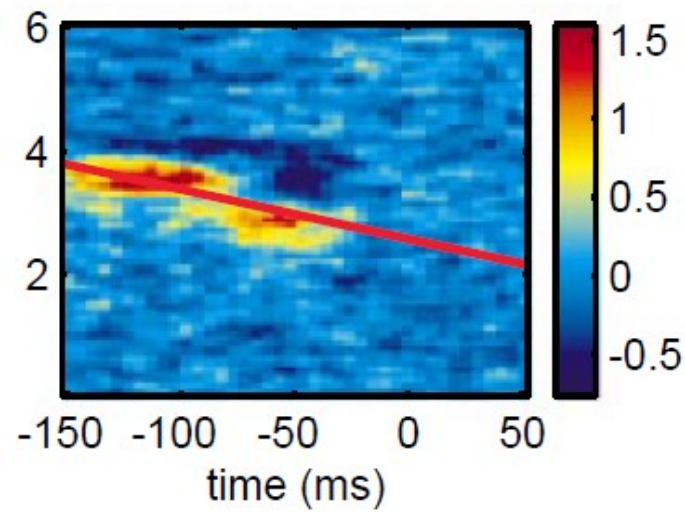


# Examples: Spectro-temporal receptive fields of A1 neurons

[de Charms, 1998]

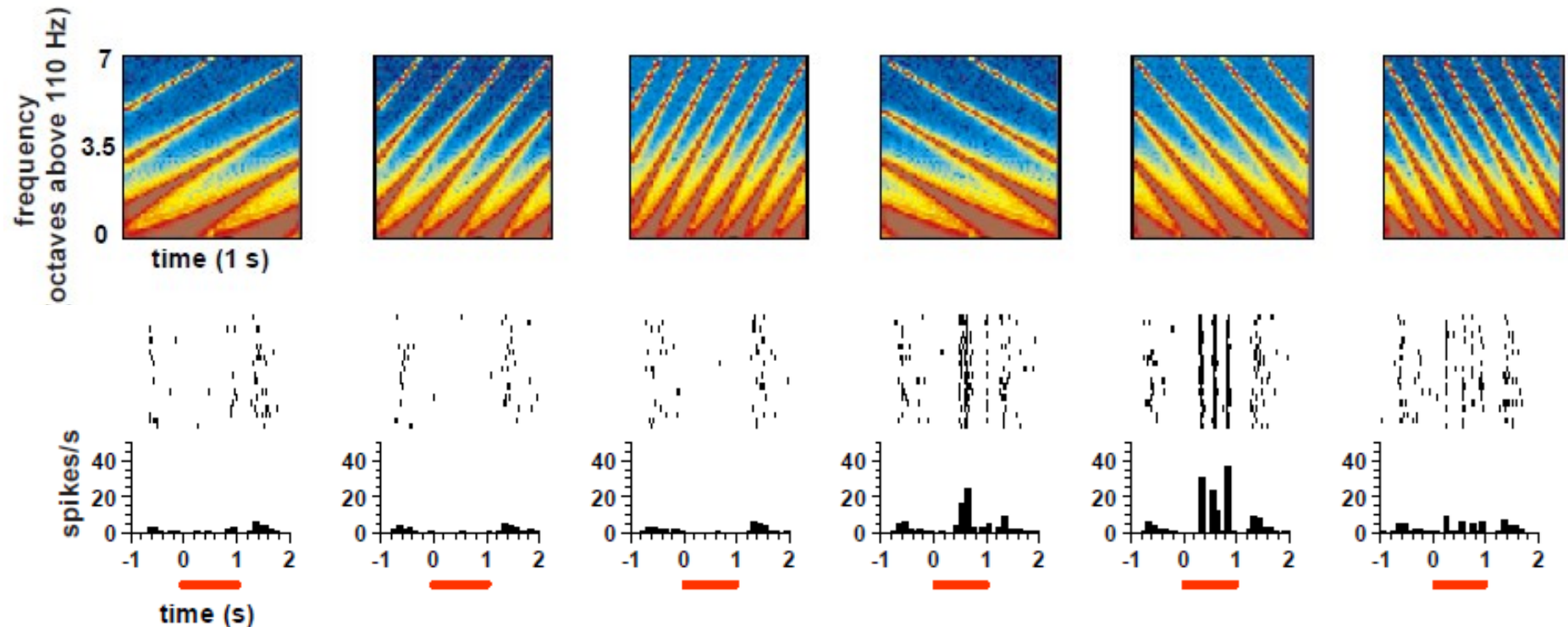






Orientation ( $\omega, t$ ) selective ?

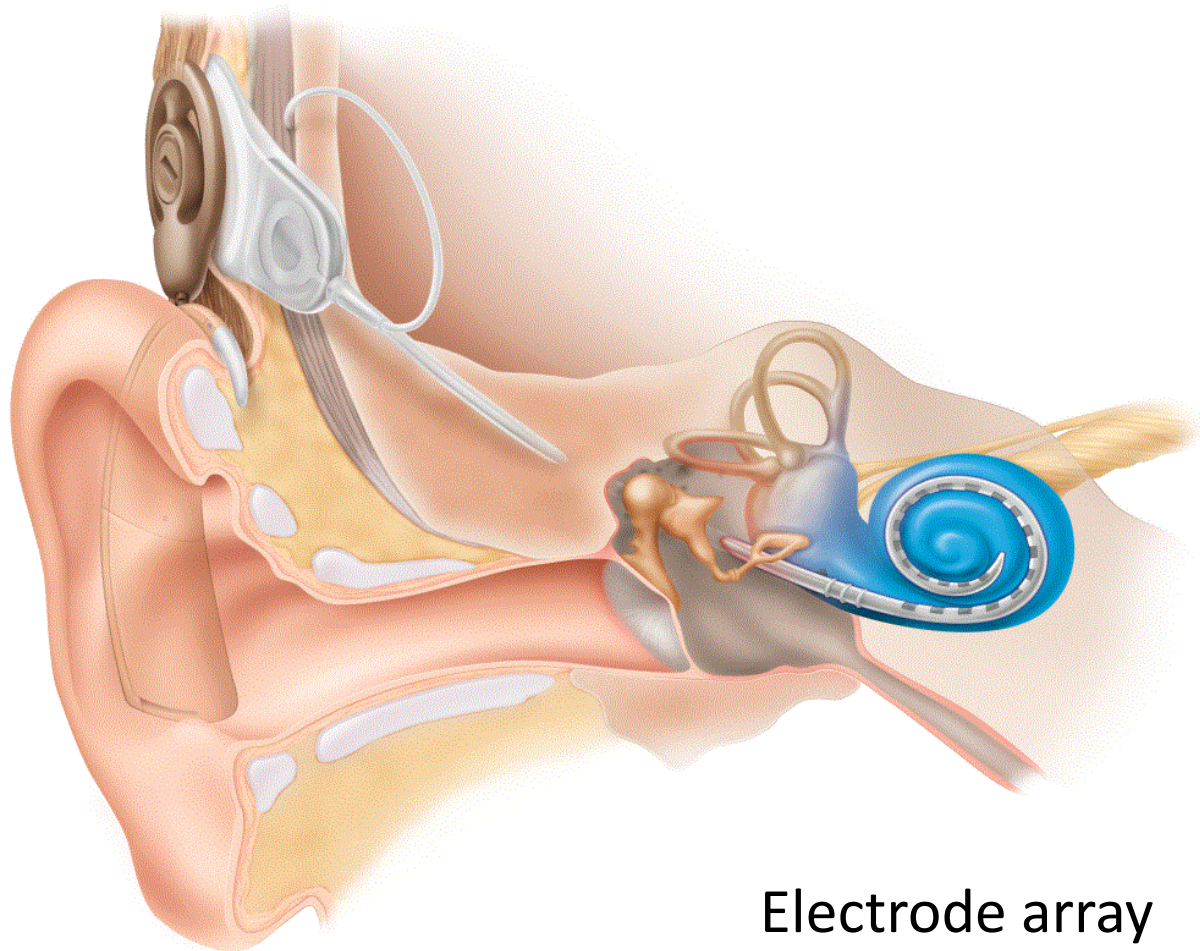
Verify the responses of the above cell to a tone and its harmonics, changing over time:



## ASIDE: Two Applications

Cochlear implants are used for profoundly deaf people whose hair cells destroyed by disease but auditory nerve is intact.

Microphone +  
speech/sound  
processor



Electrode array  
(inserted into cochlea)

# MP3: Data Compression

Simultaneous masking: what I mentioned earlier

Forward masking:

Sound at time  $t$  can mask sound at time  $t + \Delta t$  and nearby frequency bands, even if  $\Delta t$  is greater than auditory (gammatone) filter.

In both cases, you can use fewer bits to code sound and listeners won't notice.