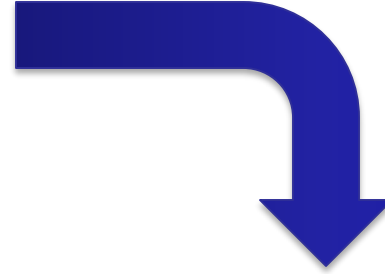


1980



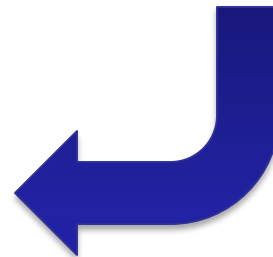
clarity, durability



1995



Miniaturization,
data compression



2010



Psychoacoustics and *two kinds of* perceptual audio coding

Duality between
data compression and
Watermarking

Yi-Wen Liu, Ph.D.

EE6641: Analysis and Synthesis of Audio Signals

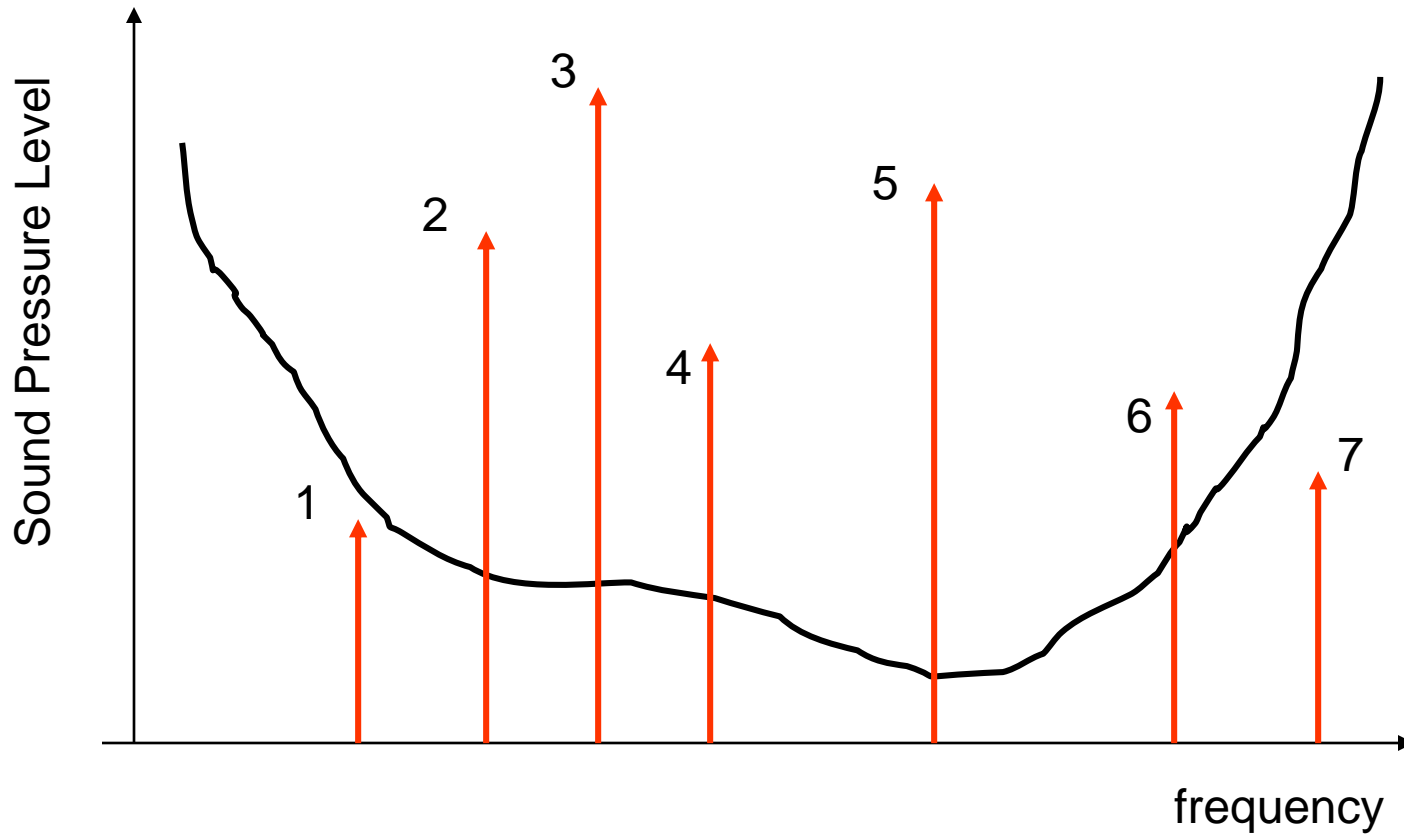
Nov. 30, 2010

Last updated Dec. 21, 2015

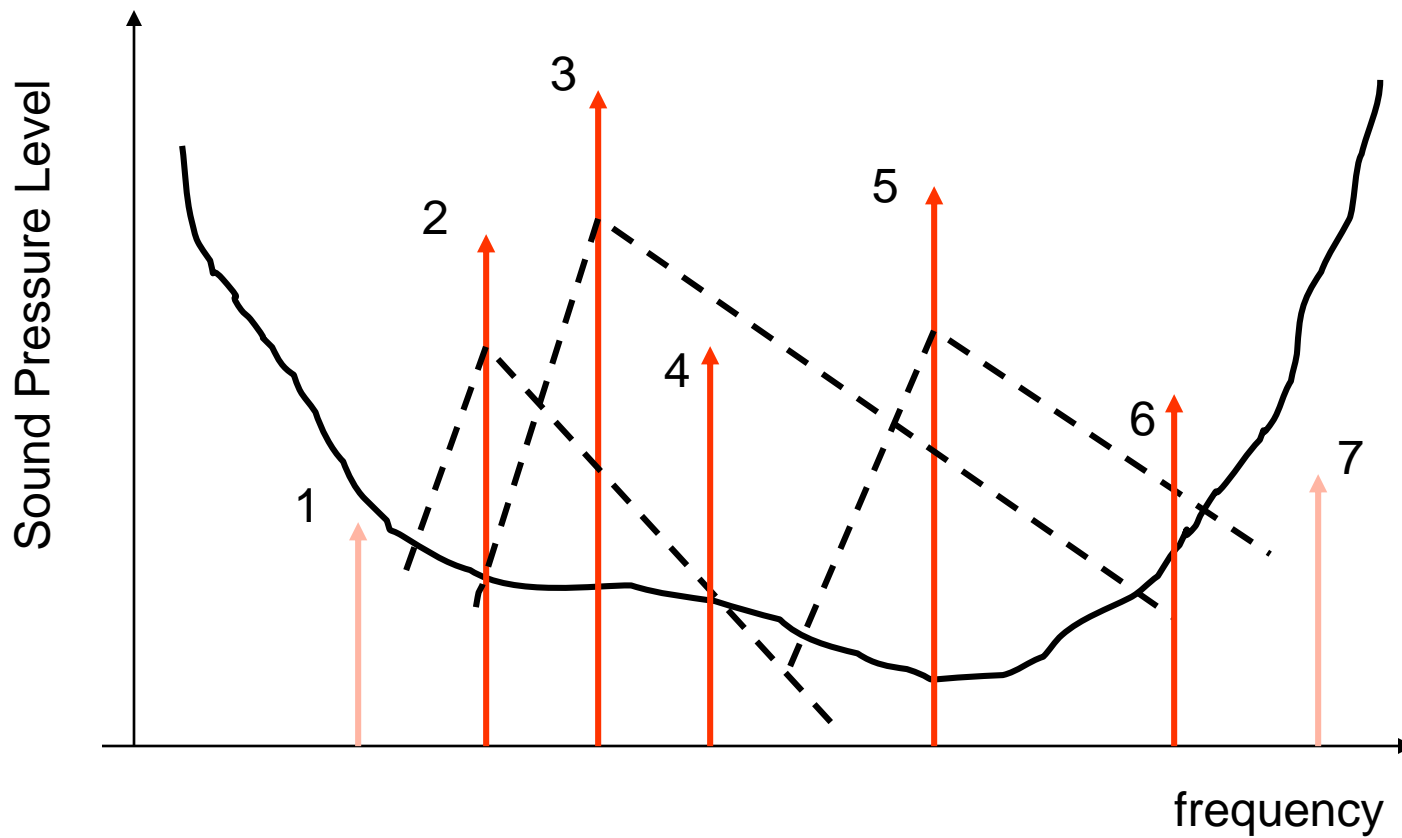
Outline

- Data Compression
 - Psychoacoustic modeling in mp3, iTunes, etc.
 - Quantization and round-off error
 - Noise hiding principle
- Digital Watermarking
 - Applications
 - Dual to data compression
 - Games between embedder and attackers
 - Useful for *digital right management*?

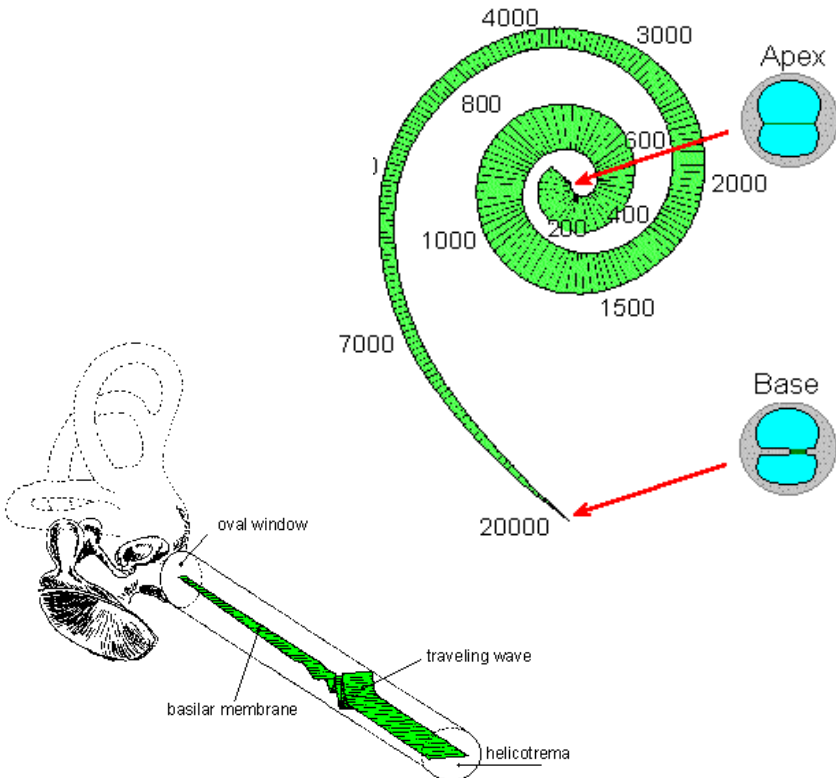
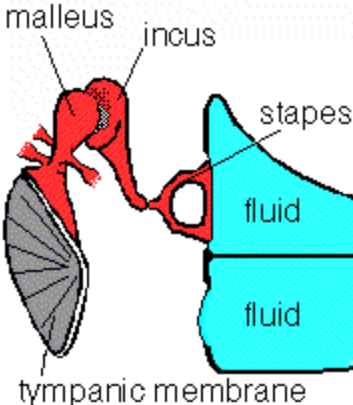
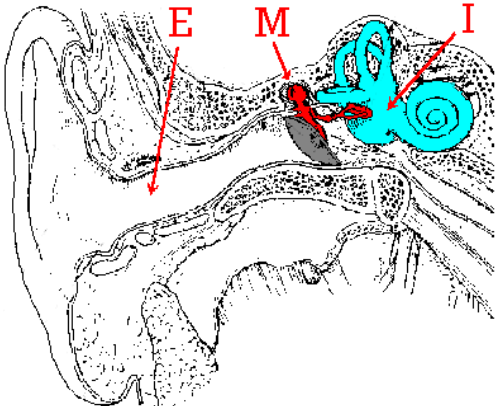
MP3 removes the in-audible,...



and also considers
psychoacoustic *masking*



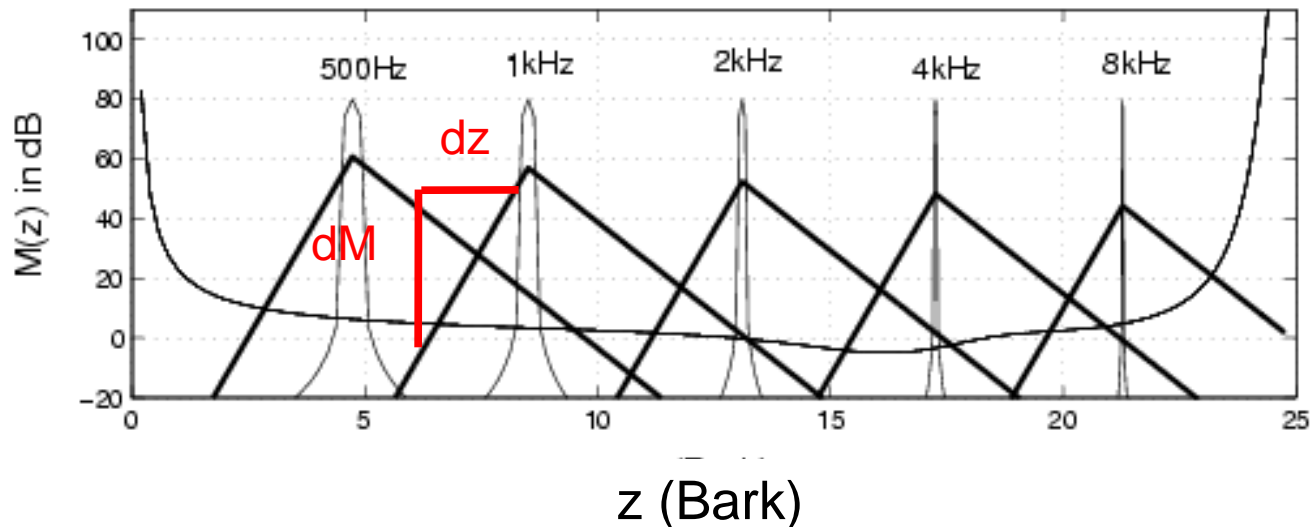
Basilar membrane as a spectrum analyzer



Images downloaded from:
<http://www.vimm.it/cochlea/cochleapages/theory/>

Spatial excitation of pure tones along basilar membrane is approximately a constant, triangular shape.

- $M(z)$, called *spreading function*,
 - $dM/dz \approx 27\text{dB/Bark}$ (or $1\text{dB} / 50 \mu\text{m}$) on the low-frequency side.
- Frequency z is measured in Barks.
 - $\Delta z = 1$ (Bark) corresponds to $\sim 1.3\text{mm}$ on basilar membrane

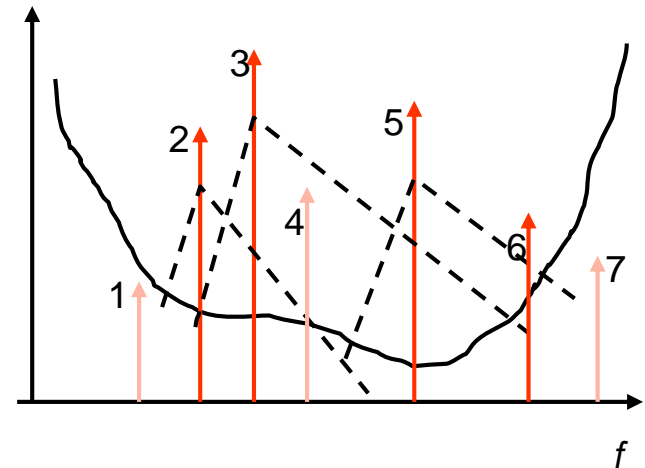


More about masking

- Tonal vs. noise masker
- Forward masking
- Pre-masking

Is audio data compression all about removing the inaudible?

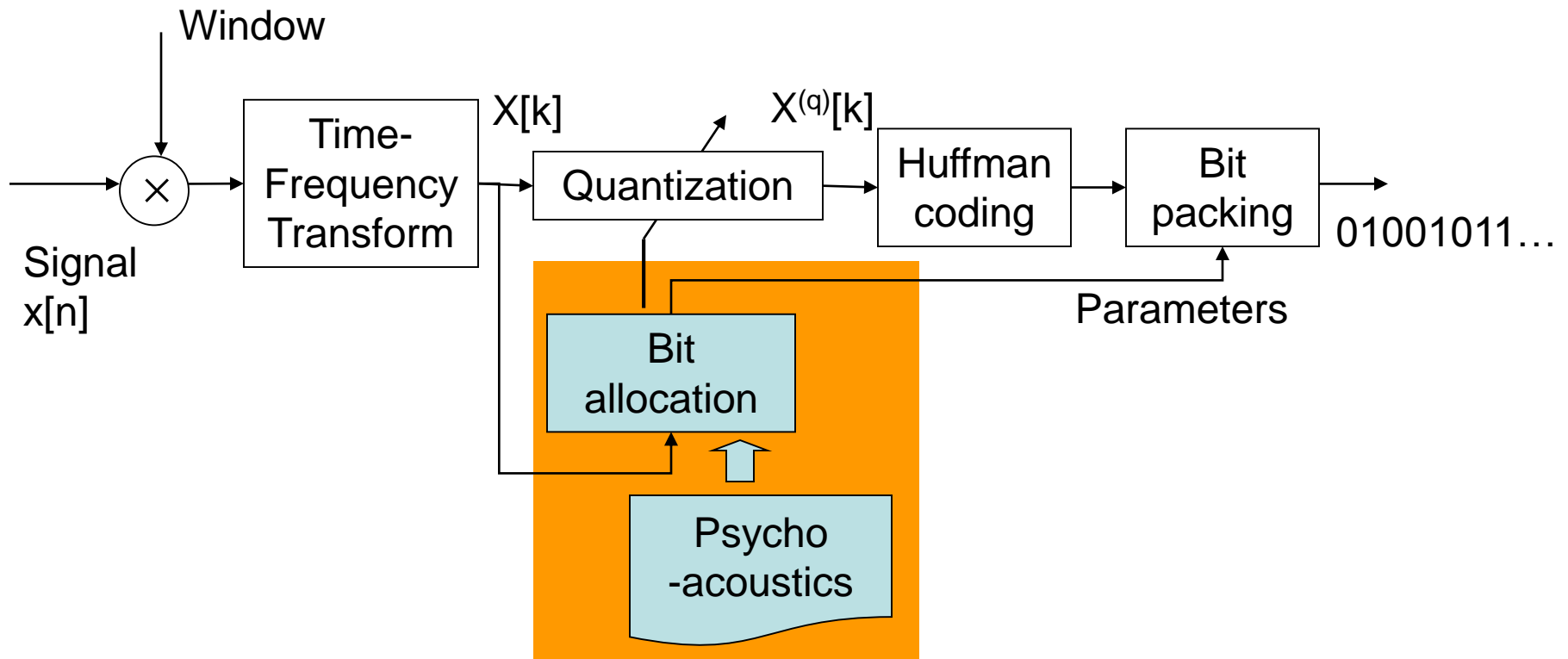
- In this example, 3 out of 7 tones are removed. So, compression ratio is approximately 42%.
- To compare,
 - MP3: >80% (5:1),
 - AAC*: > 90% (10:1),with “good” sound quality.



*AAC is Apple's audio format.

Noise shaping in audio coding:

Quantization error $X^{(q)}[k] - X[k]$ to be masked



Binary Representation of Numbers

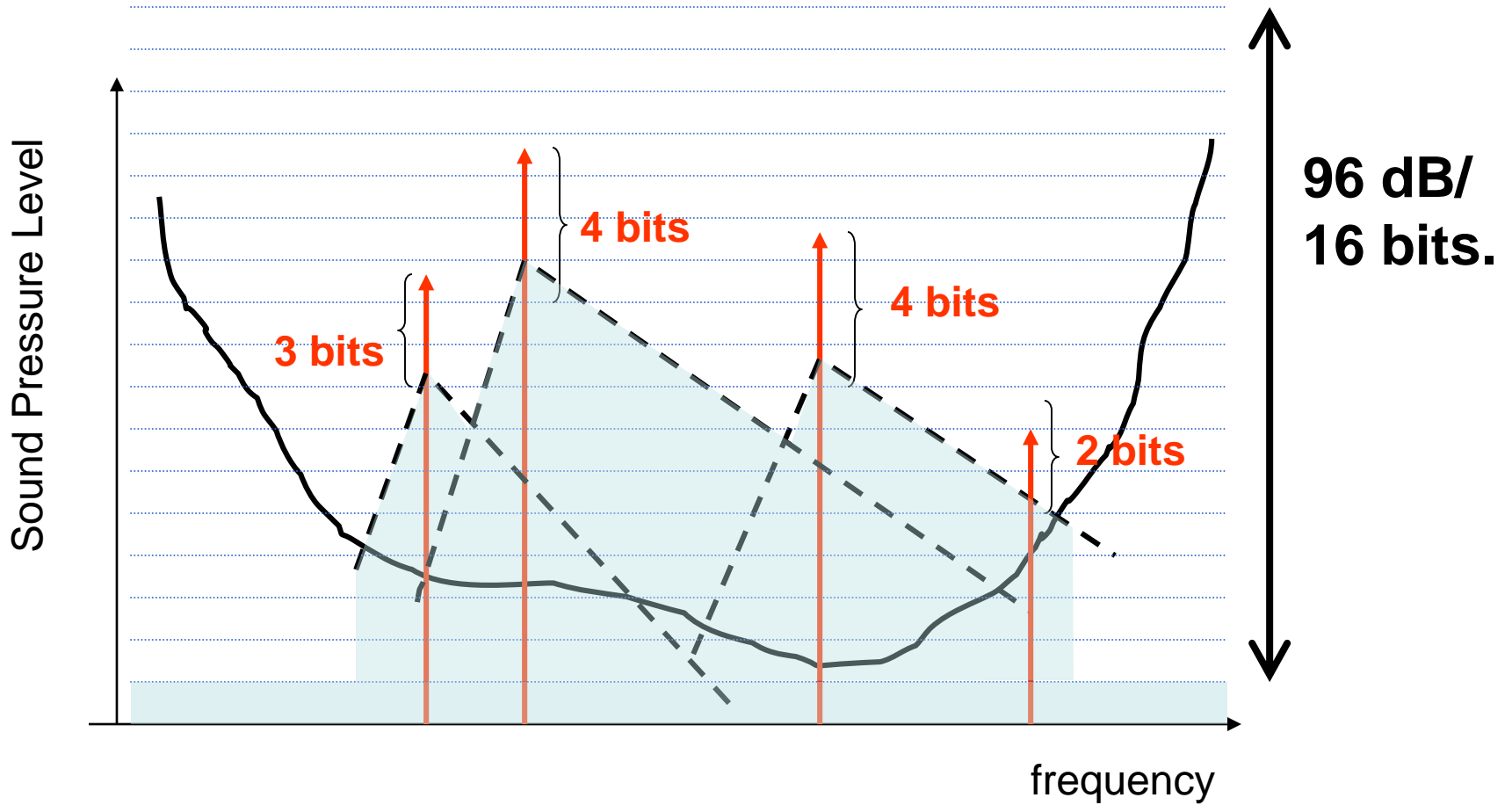
- Step 1: Determining number of bits (N) to use
- Step 2: Divide full signal range $\pm R$ by 2^N equally spaced *quantization points* (QP).
 - Each QP uniquely represented by binary string of length N.
- Step 3: For any floating-point number, find nearest QP.
 - $R = 32, N = 6, 2^N = 64;$
so, $(20.79)_{10} \sim 21 = (010\ 101)_2$

More on quantization

Range	N	Quantiz. Pts.	Step-size	Decimal	Approx.	Binary
± 32	6	64	1	20.79	21	010 101
± 32	5	32	2	20.79	20	010 10
± 32	4	16	4	20.79	20	010 1
± 32	3	8	8	20.79	24	011

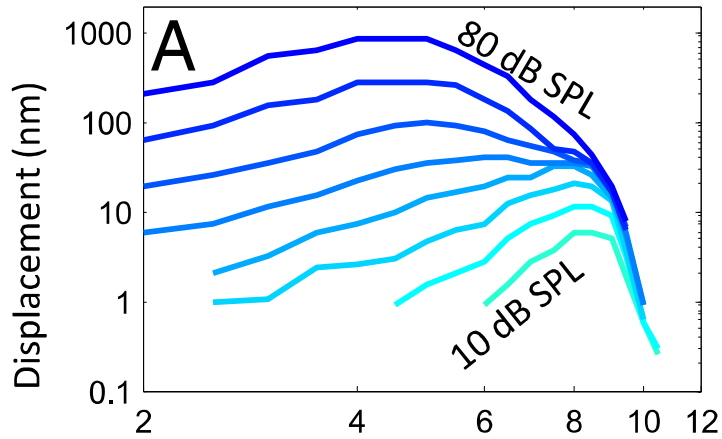
Statistically, each additional bit improves signal-to-noise ratio (SNR) by 2-fold.

SNR = 6 dB/bit

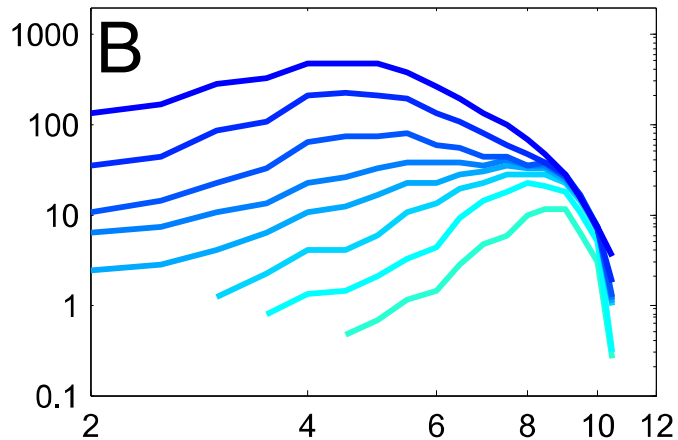


Remarks on the excitation pattern

BM

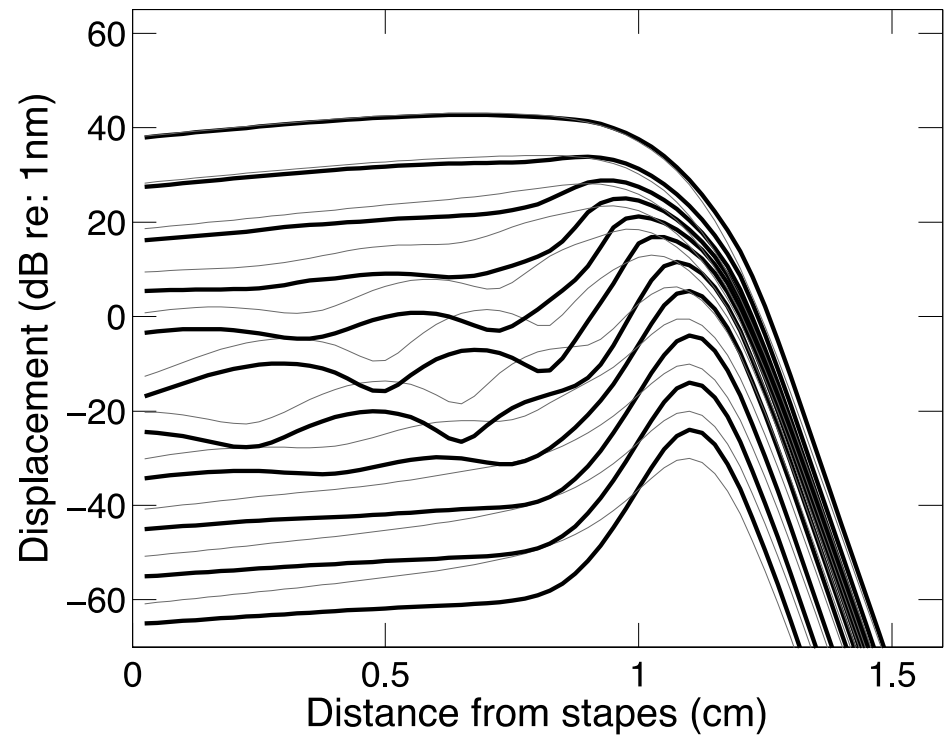


TM



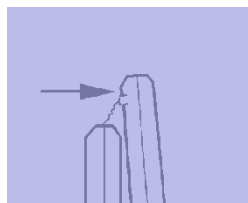
Lee et al. (2015)

Liu and Neely (2010)

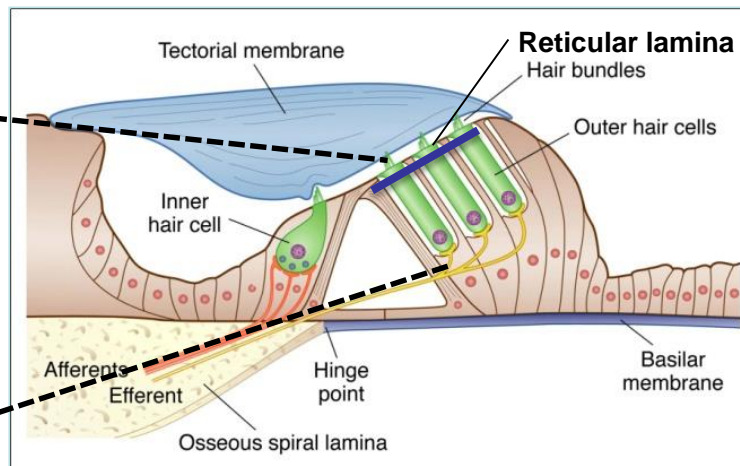
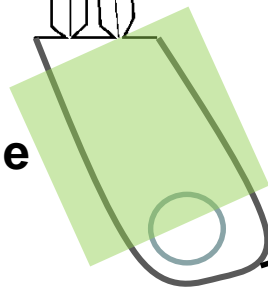


電生理、細胞組織結構、與流體方程之 整合模型 (Liu and Neely, 2010)

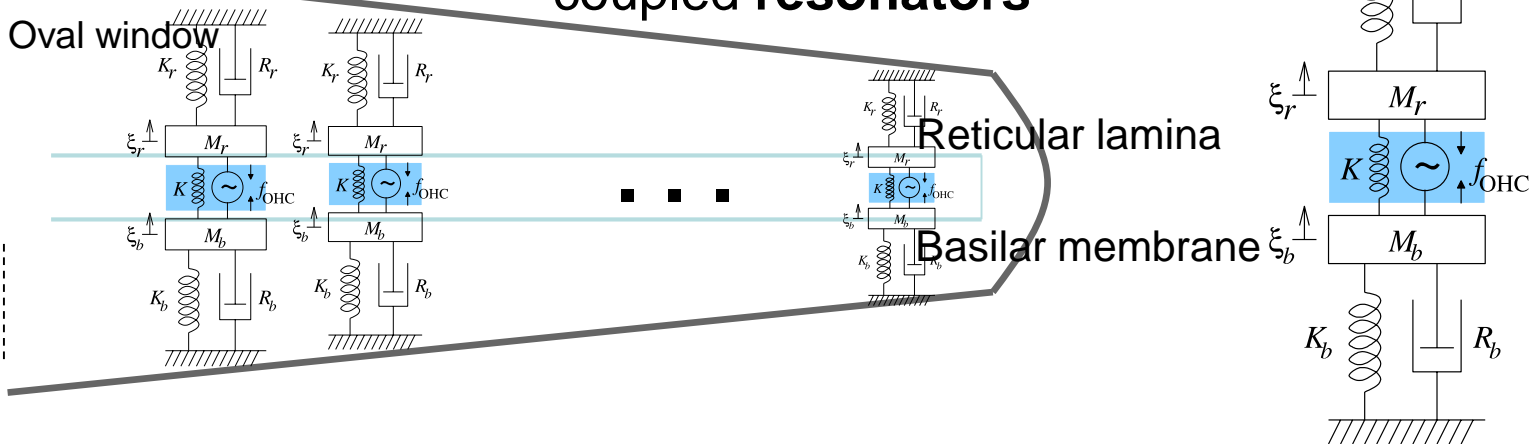
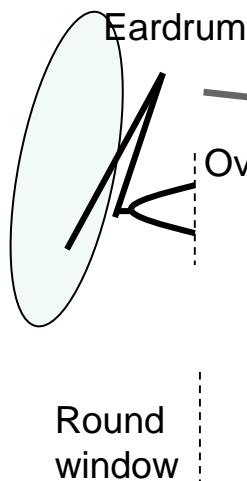
1. Transduction channel



2. Piezoelectric membrane



3. Cochlea: coupled resonators



Work done at Boys Town, and continuing at Tsinghua (Hsinchu, Taiwan)

- Liu, Y.-W., Yu, L.-M., Wu, P.-J. (2014). “Close-loop simulation of the medial olivocochlear (MOC) anti-masking effects,” to appear in *Proc. the 12th Int. Mechanics of Hearing Workshop*, Attica, Greece.
- Liu, Y.-W. (2014). “Stationary noise responses in a **nonlinear** model of cochlear mechanics: Iterative solutions in the frequency domain,” submitted to *J. Acoust. Soc. Amer.*
- Liu, Y.-W., and Neely, S.T. (2013). “Suppression tuning of **distortion-product otoacoustic emissions**: Results from cochlear mechanics simulation,” *J. Acoust. Soc. Am.* **133**, 951-961.
- Liu, Y.-W. and Neely, S.T. (2012a). “Quasilinear cochlear responses to noise can result from instantaneous **nonlinearities**,” in *What Fire is in Mine Ears: Progress in Auditory Biomechanics*, C. A. Shera and E. Olson (Eds.). New York: American Institutes of Physics, pp. 218-223.
- Liu, Y.-W., and Neely, S. T. (2010). “**Distortion product emissions** from a cochlear model with **nonlinear** mechano-electrical transduction in **outer hair cells**,” *J. Acoust. Soc. Am.* **127**, 2420-2432.
- Keefe D. H., Fitzpatrick D., Liu, Y.-W., Sanford C. A., and Gorga, M. P. (2010). “Wideband acoustic reflex test in a test battery to predict middle-ear dysfunction,” *Hear. Res.* **263**, 52-65.
- Liu, Y.-W., and Neely, S.T. (2009). “**Outer hair cell** electromechanical properties in a **nonlinear** piezoelectric model,” *J. Acoust. Soc. Am.* **126**, 751-761.
- Sanford, C.A., Keefe, D.H., Liu, Y.-W., Fitzpatrick, D.F., McCreery, R.W., Lewis, D.E., and Gorga, M.P. (2009) “Sound-conductance effects on DPOAE screening outcomes in newborn infants: Test performance of wideband acoustic transfer functions and 1-kHz tympanometry,” *Ear & Hearing* 30(6): 635-652
- Liu, Y.-W., Sanford, C.A., Ellison, J.C., Fitzpatrick, D.F., Gorga, M.P., and Keefe, D.H. (2008). “Wideband absorbance tympanometry using pressure sweeps: System development and results on adults with normal hearing,” *J. Acoust. Soc. Amer.* **124**, 3708-3719.

MP3 vs. AAC

- MPEG-1 Layer III
 - Finalized in 1992
 - Known as MP3
 - Good at 128 kbits/s, per channel.
- MPEG-2/4 Advanced Audio Coding (AAC)
 - Finalized in 1997
 - Known as the Apple iTunes music format.
 - Good at 128 kbits/s, per *stereo*.
 - Not compatible to MP3
 - Its old name: MPEG-2 NBC (Non-Backward Compatible).

Sound quality evaluation

- Judged by professional golden ears
- Played back in professional studio room
- Randomized, double-blinded R-A-B tests

Quality	Impairment
5	Imperceptible
4	Perceptible, but not annoying
3	Slightly annoying
2	Annoying
1	Very annoying

- Good compression algorithm scores > 4.0 for European Broadcast Union's "Sound Quality Assessment Materials".

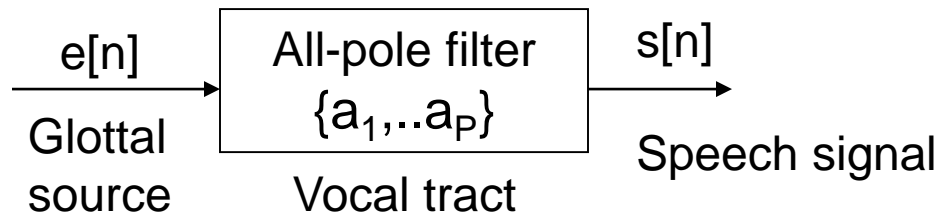
Speech coding vs. audio coding

- Speech coding:
 - Parametric, based on production model
 - Sampling rate 16 kHz is usually sufficient
 - Targeting data rate <10 kbps
 - Not good for coding music
- Audio coding:
 - Non-parametric, based on perceptual model
 - Sampling rate 44.1 kHz or higher
 - Targeting data rate 128 kbps/stereo

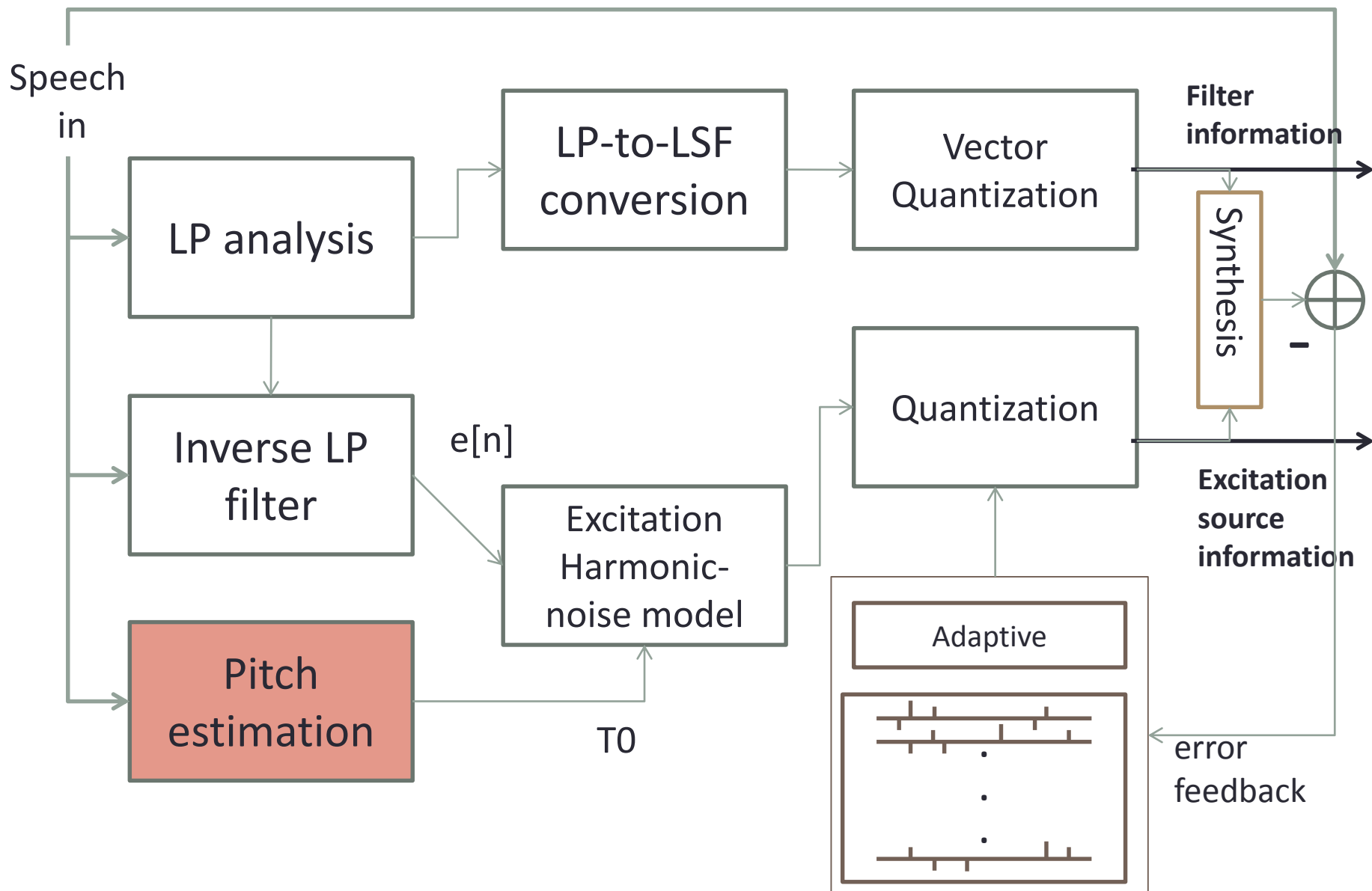
DETOUR TO A SPEECH CODING STANDARD (CELP)

Possible applications of LP

- **Speech synthesis:** By replacing $e[n]$ with a template, speech compression achieves $<8k$ bits/s.
 - Codebook excited linear prediction (CELP)
 - key technology for voice over internet and wireless networks.
- **Speech recognition:** From $\{a_1, \dots, a_p\}$, we can estimate
 - Vocal tract constriction
 - Frequency-envelope; formant structure.



Code-Excited Linear Prediction



了不起的地方

- $\frac{1}{4}$ bit per sample x 8000 samples/sec = 2 kbps.
- Digital telephone land line = 64 kbps.
- 32:1 data compression, proposed in 1985!
 - At AT&T Bell Labs.
 - However...

Coding procedure was very expensive

“...It took 125 sec of **Cray-1** CPU time to process 1 sec of the speech signal.”

- Cray-1 (1975): 80-MHz “super computer”.



Topic II: Watermarking

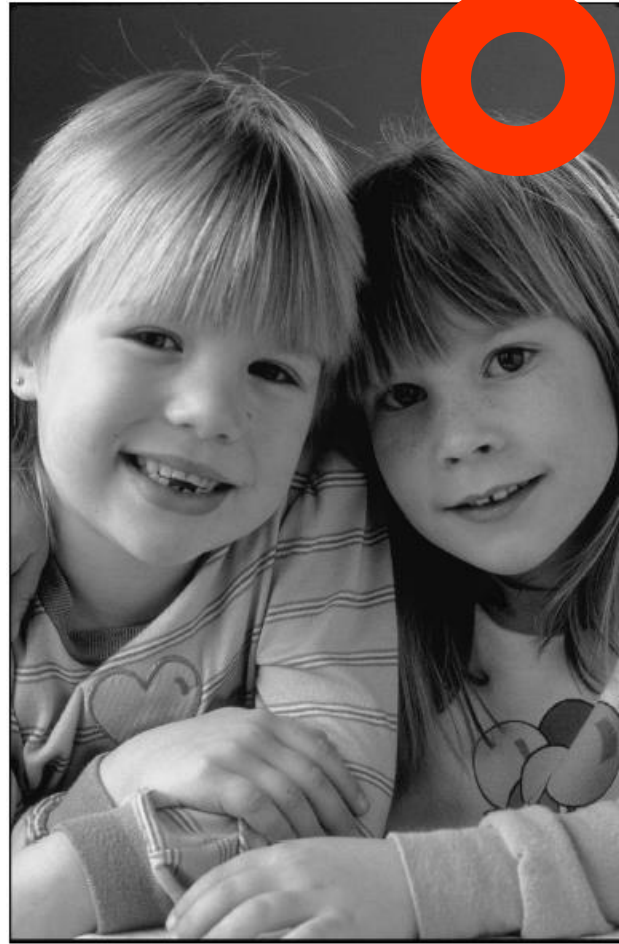
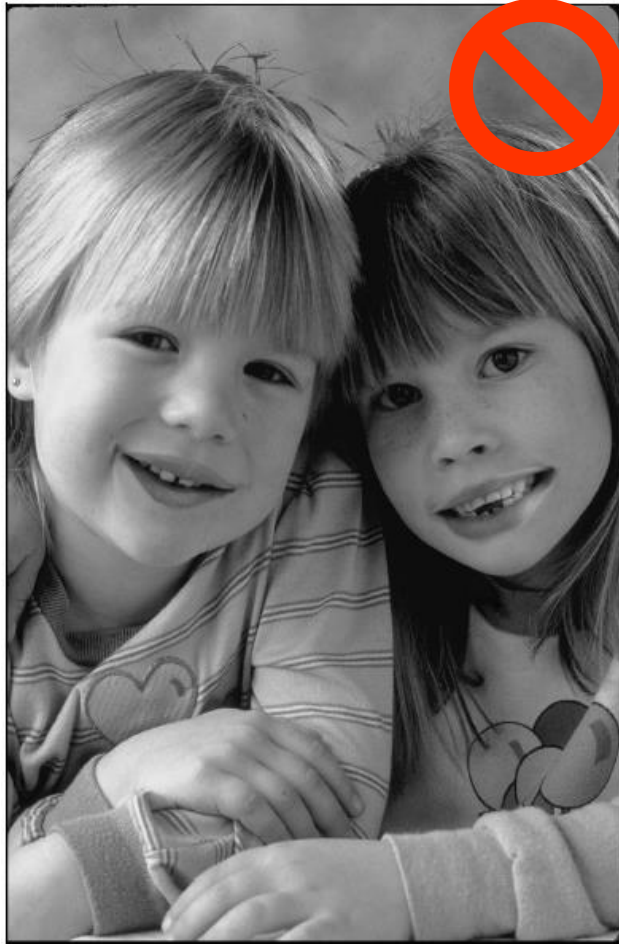


Bureau of Engraving and Printing,
United States Department of the Treasury
<http://www.moneyfactory.com/>

Digital watermarking

Adapted from: E. Lin et al. (2000).

“Detection of image alterations using semi-fragile watermarks”

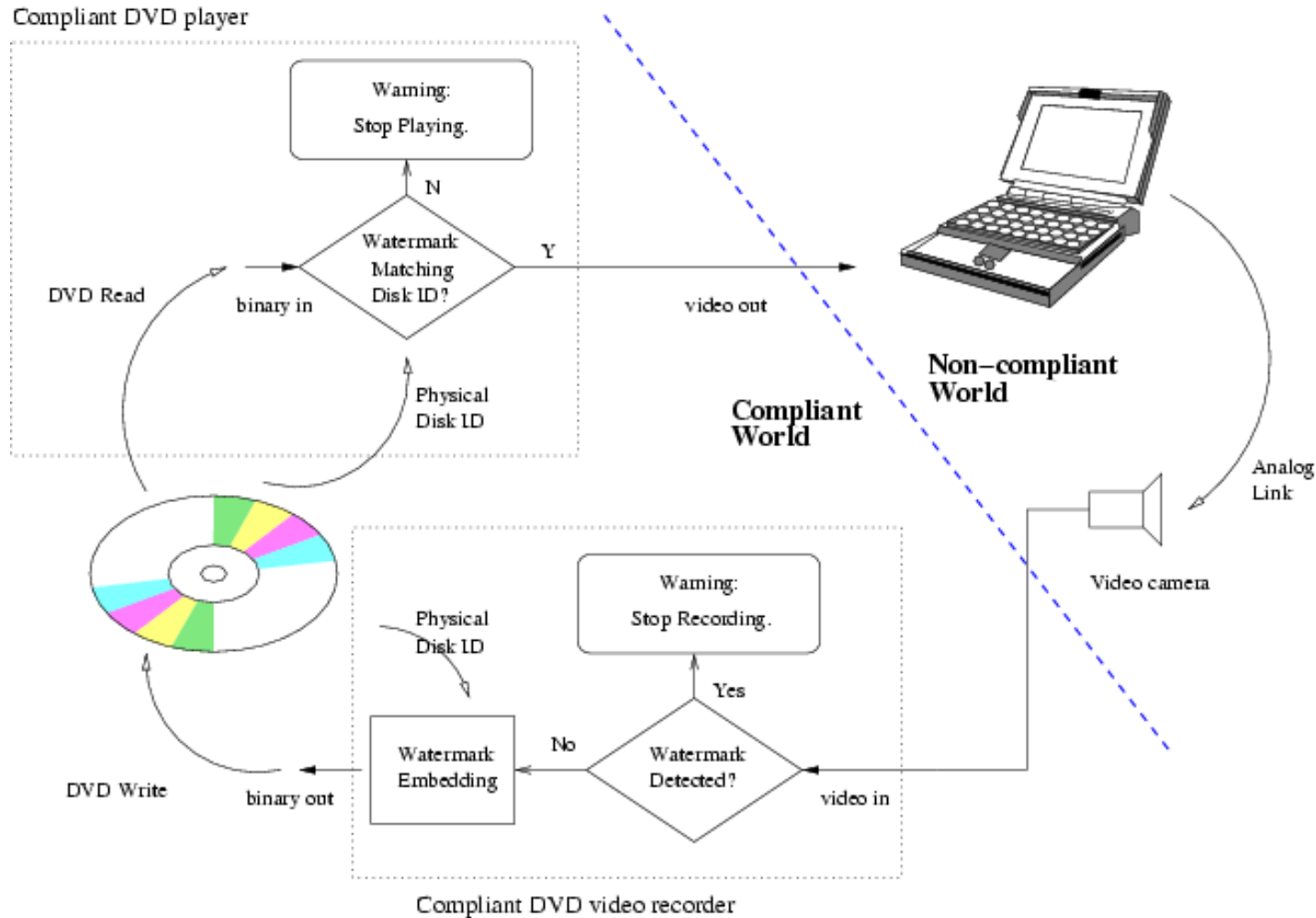


Application #1: forgery detection



Application #2: copy management

J.-P. Linnartz *et al*, "System aspects of Copy Management for digital video" (2000)



Application #3: automatic broadcast monitoring

J. Gertner, "Our Ratings, Ourselves", *the New York Times Magazine*, April 10, 2005

"Television and media will change more in the next 3 to 5 years than it's changed in the past 50."

~ Bob Luff, chief technology officer, Nielsen Media

- TV on cellphone
- Radio on Web
- iPod, video-on-demand, PlayStation Portable...
 - It becomes difficult to measure people's exposure to media.

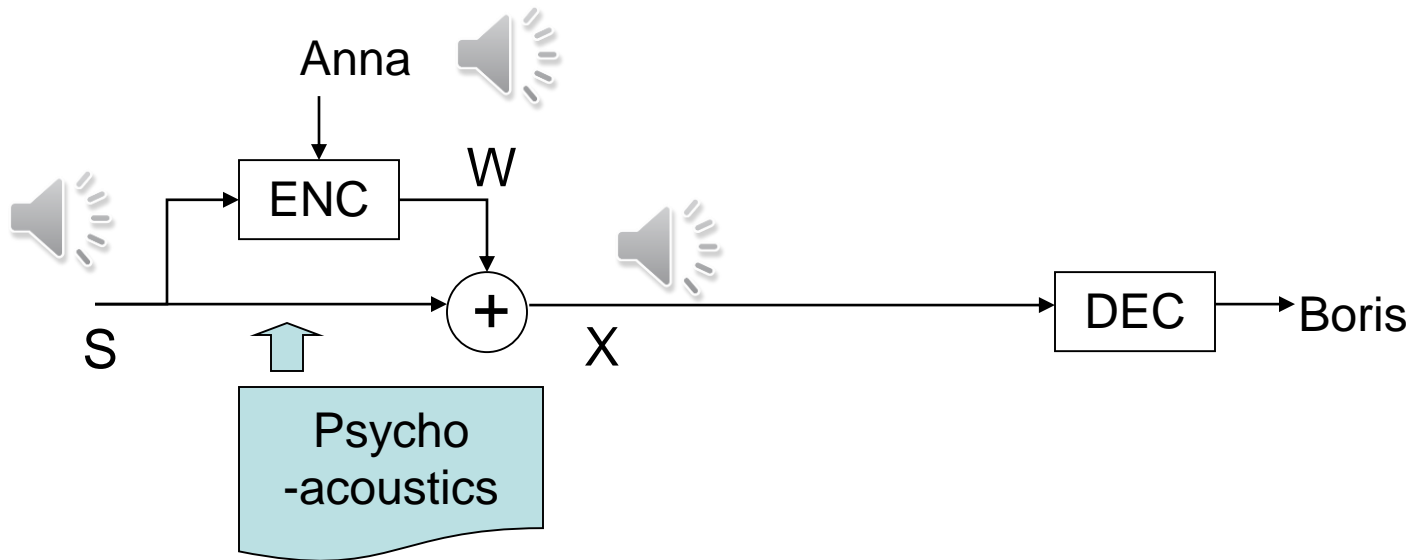
“Portable people meter” (PPM)

- Programs and commercials are embedded with acoustical watermarks
- A wearable device
 - Picks up the watermarks
 - Identifies programs
- System tested in Houston
 - By Arbitron Inc. (NYSE: ARB)



http://www.arbitron.com/portable_people_meters/home.htm

The principle of watermarking: *noise is signal and signal is noise.*

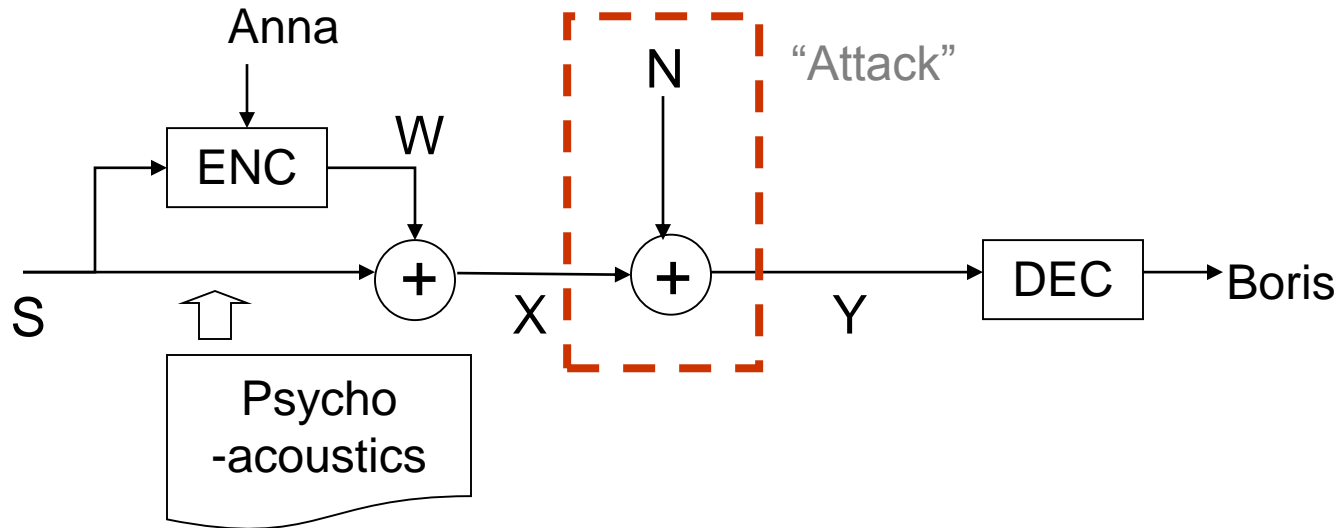


W: Watermark
S: Signal

X: Watermarked signal

浮印植入者與破壞者的賽局

The **game** between embedder and attacker



W: Watermark
S: Signal

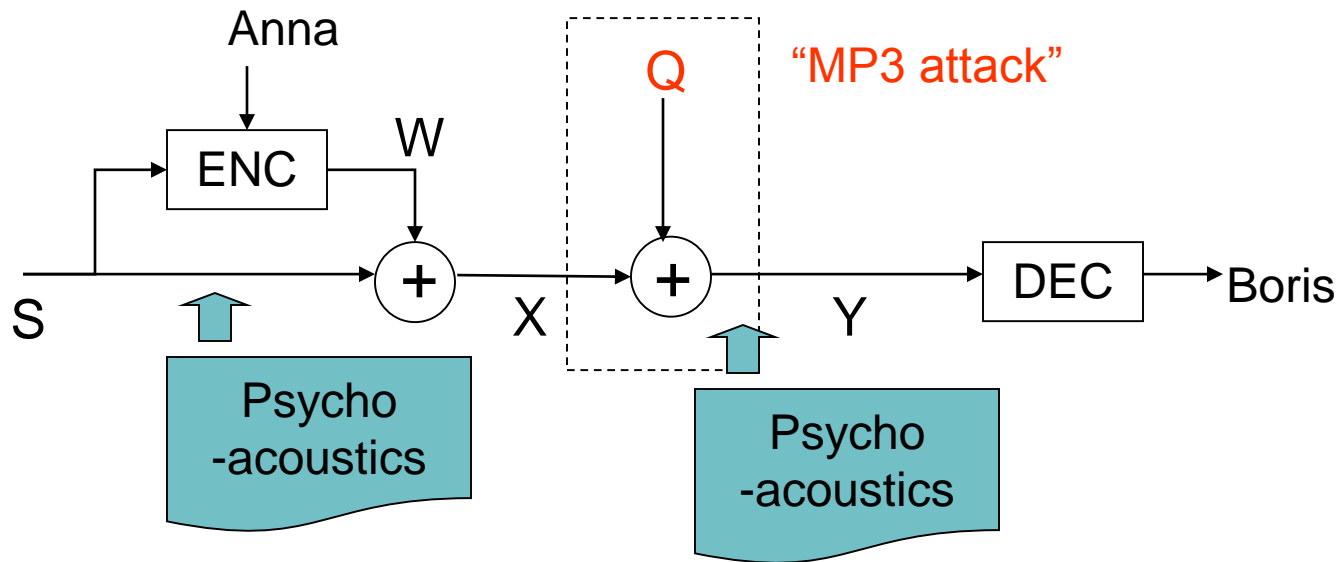
X: Watermarked signal
N: Noise
Y: Corrupted copy of X

Common misconception

- audio watermarks are *useless* because
 - They are inaudible
 - MP3 removes everything inaudible
 - therefore, MP3 erases watermarks

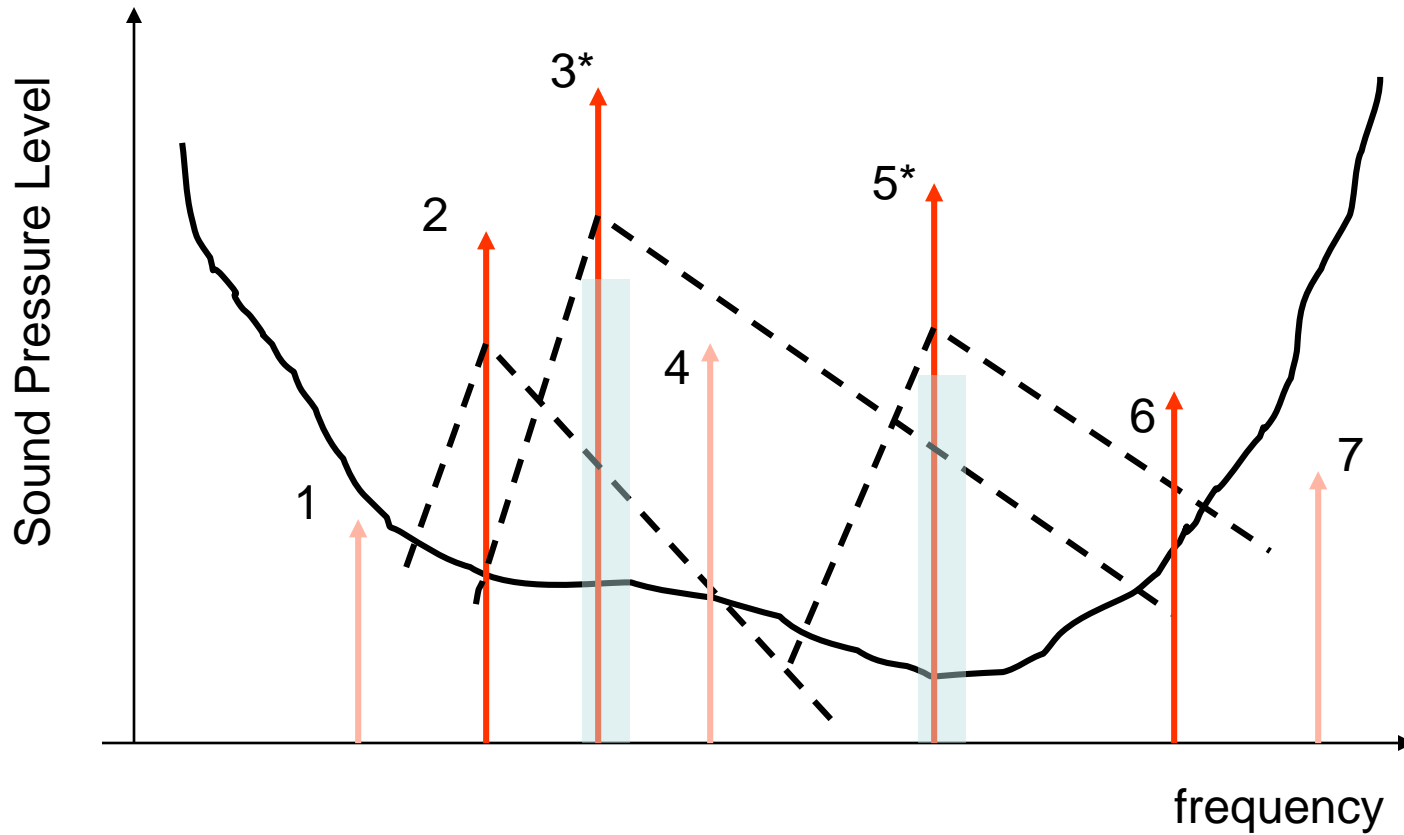
Rules of the Game

1. Embedder plays first.
2. Attacker also needs to consider psychoacoustics.

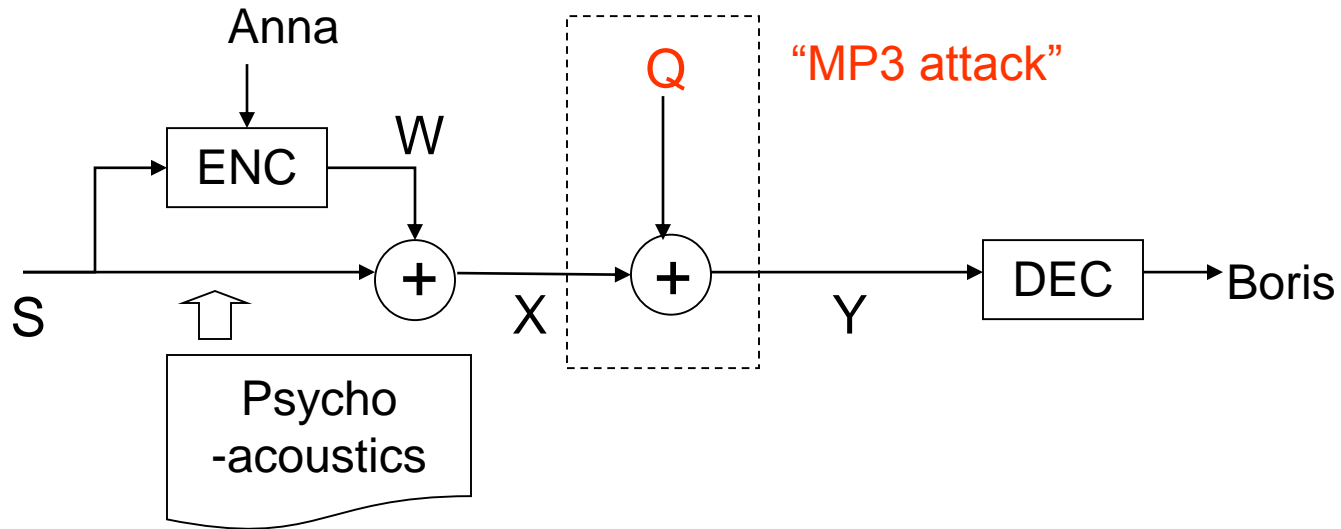


Optimal embedding strategy:

Watermark is indistinguishable from signal, but decodable by *coherent detection* via a private key.



Quantization introduces noise;
Watermark-to-noise ratio is improved by averaging.



W: Watermark
S: Signal
Q: **Quantization noise**

$$Y = S + W + Q.$$

Duality of data compression and watermarking

	Compression	Watermarking
Noise to be hidden	Quantization noise	Watermarks
Information theoretic models	Source coding (Rate-distortion problem)	Channel coding (communication)
Rules	<ul style="list-style-type: none">• Encoder: secret• Decoder: public	<ul style="list-style-type: none">• Encoding: public*• Decoder: blind

* except for the crypto-key.

Usefulness of audio watermarking is still uncertain in future

- Apple relinquished **digital right management (DRM)** for iTunes since Feb. 2009
 - DRM = Digital Restriction Management?
 - It does not help business.
- Microsoft licensed audio watermarking technology to Active Content Corp. in Aug. 2007
 - “Personalized” ads bundled to music

Summary

- Audio Data Compression
 - Psychoacoustic masking enables 10:1 compression in AAC.
 - 6 dB SNR improvement for every extra bit.
 - Format is standard, but encoding is commercial secret.
- Audio Watermarking
 - Using psychoacoustics for data hiding
 - Robust to MP3
 - Future application is uncertain.