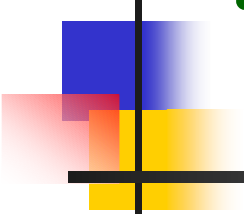


# Sampled-data Control and Signal Processing

## - Beyond the Shannon Paradigm



---

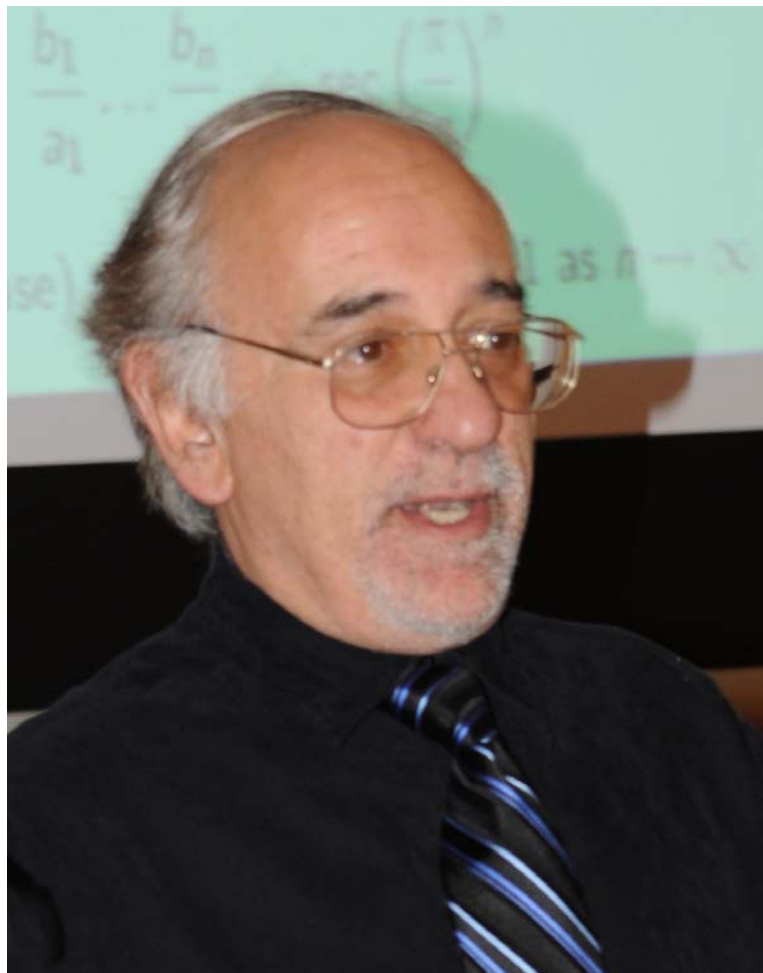
Workshop in honor of Eduardo Sontag  
on the occasion of his 60<sup>th</sup> birthday

Yutaka Yamamoto

[yy@i.kyoto-u.ac.jp](mailto:yy@i.kyoto-u.ac.jp)

[www-ics.acs.i.kyoto-u.ac.jp](http://www-ics.acs.i.kyoto-u.ac.jp)

# Thanks to



My schoolmate,  
dear friend,  
colleague, and  
even a teacher

One of the very rare pictures of Eduardo with a Tie:  
at my (YY) fest



# Outline

---

- Current signal processing paradigm
  - Via Shannon
  - $\Rightarrow$  Upper limit in high frequencies
- **CAN BE SAVED** via sampled-data control theory
- Some examples



# Message of this talk

---

- We can do better in signal processing using **sampled-data control theory**
- $\Rightarrow$  **Optimal recovery of freq. components beyond the Nyquist freq. (= 1/2 of sampling freq.)**



# Let's first listen to a demo

---



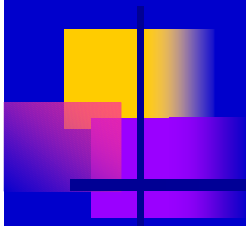
アプリケーション

Red: Original (up to 22kHz)

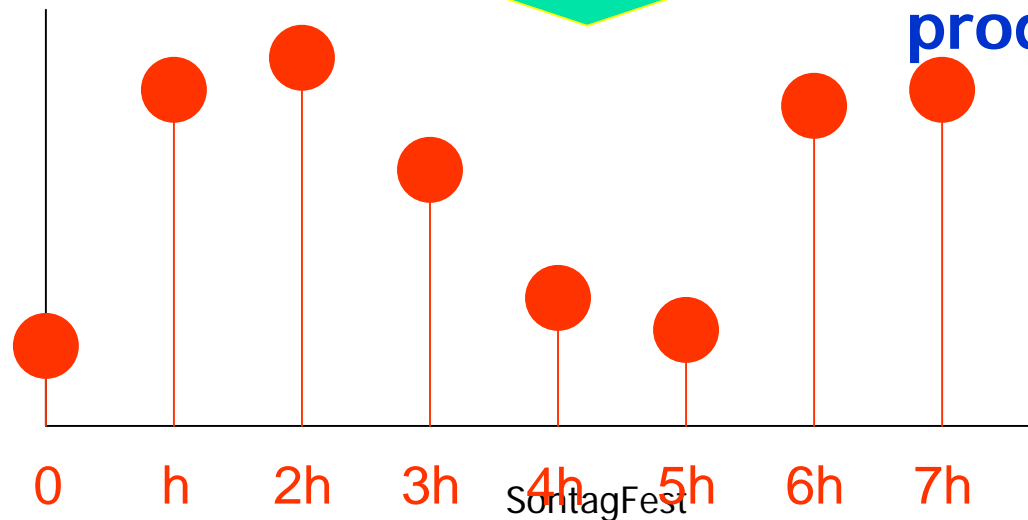
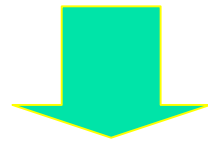
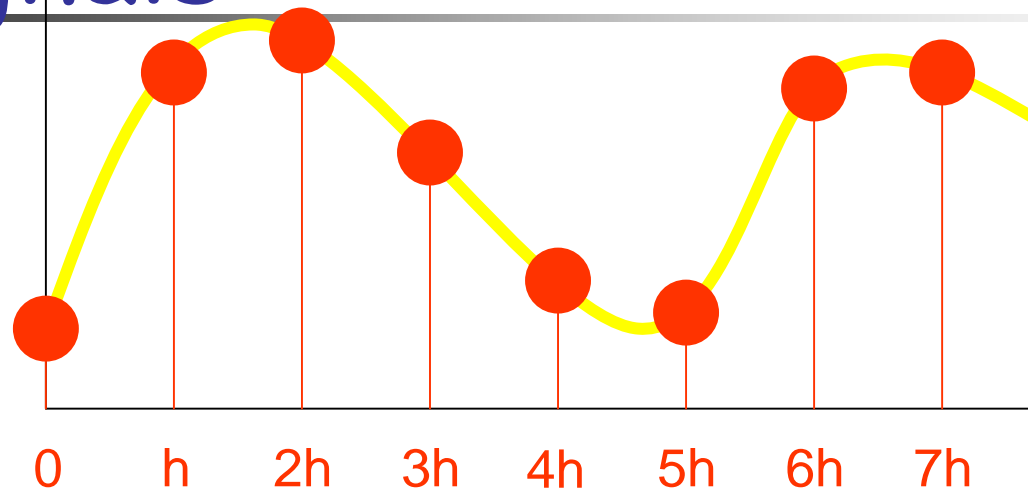
Blue: downsampled to 11k, and  
then processed 4 times  
upsampled via YY filter

Did you hear the difference?

# Part I: Current digital signal processing - Basics 😊

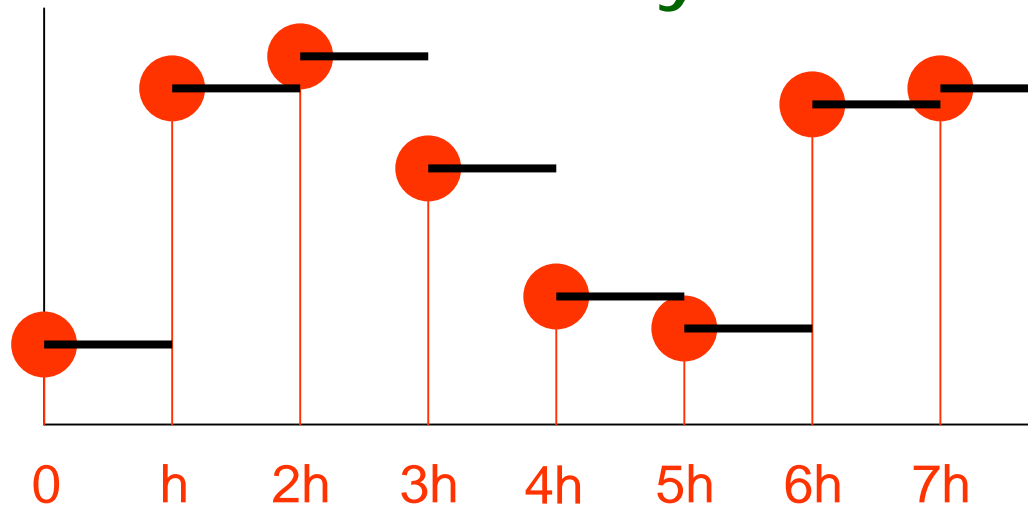


# Sampling continuous-time signals



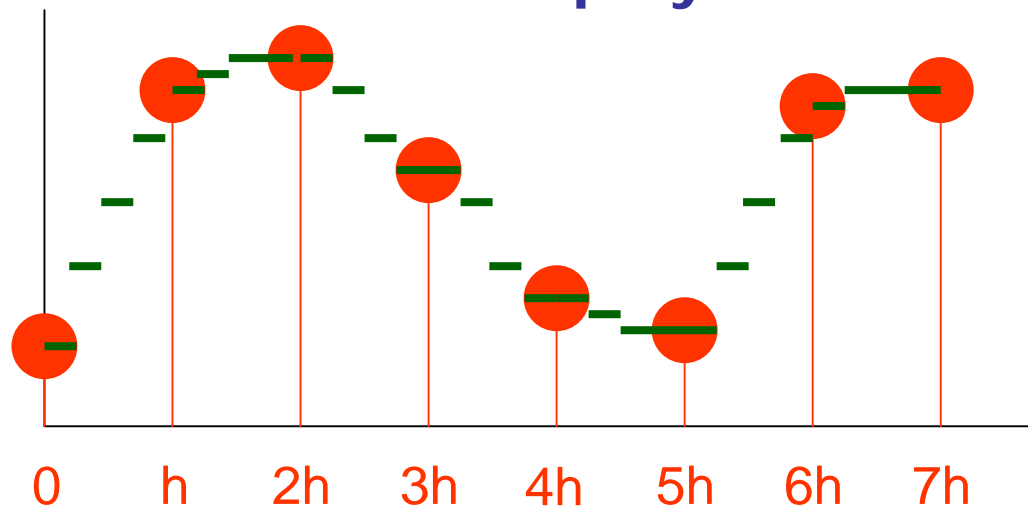
**This does not produce a sound**

# Hold device is necessary



Simple 0-order hold

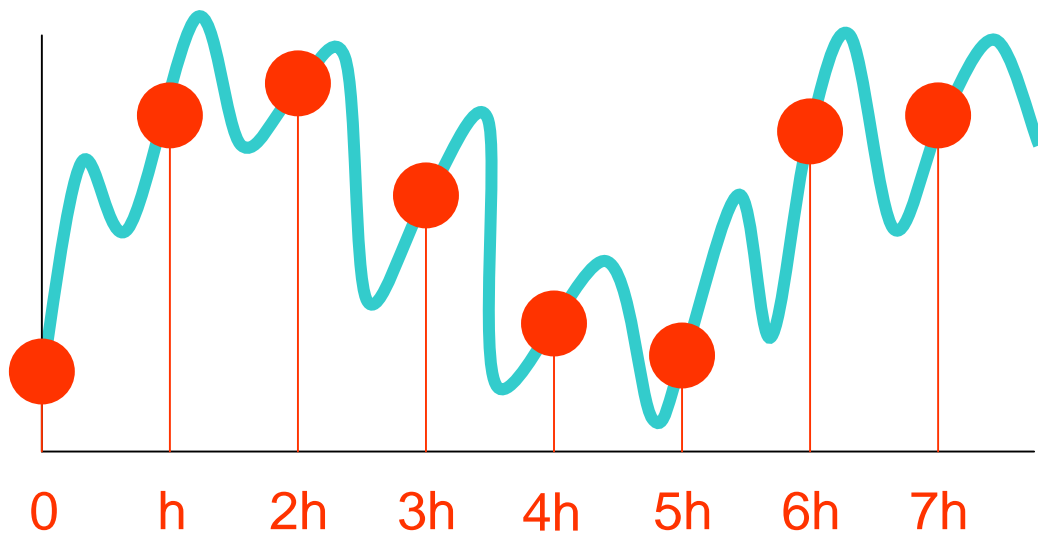
## Old CD players



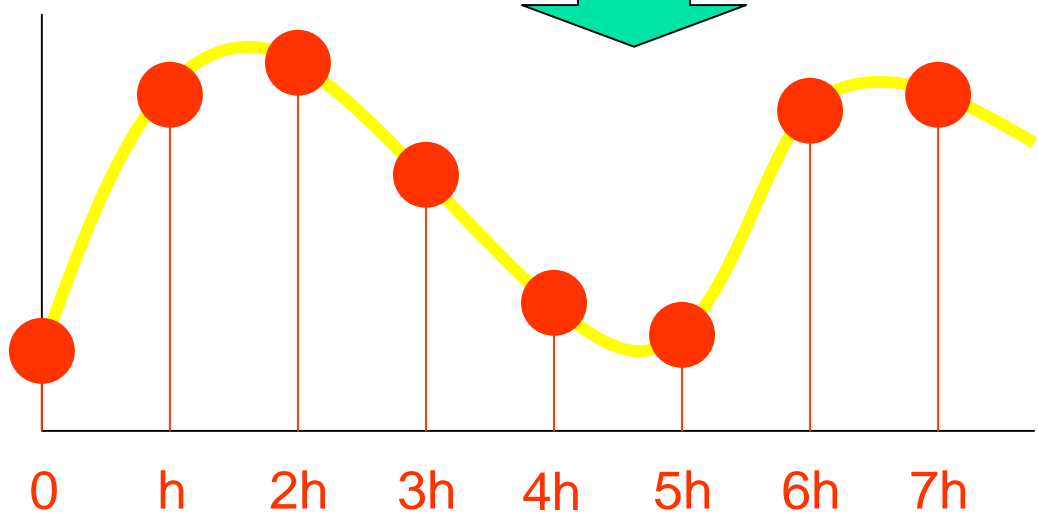
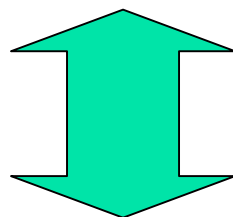
Oversampling DA converter

## More recent players

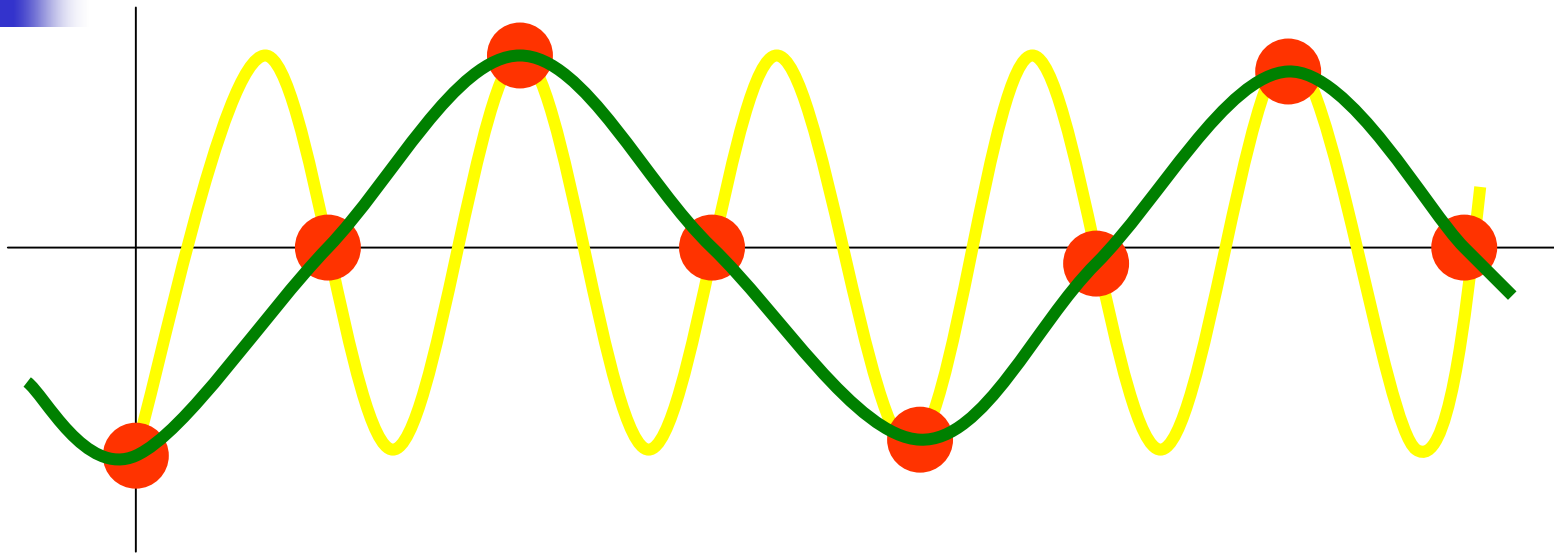




Questions



# Typical problem: Sampling $\rightarrow$ Aliasing



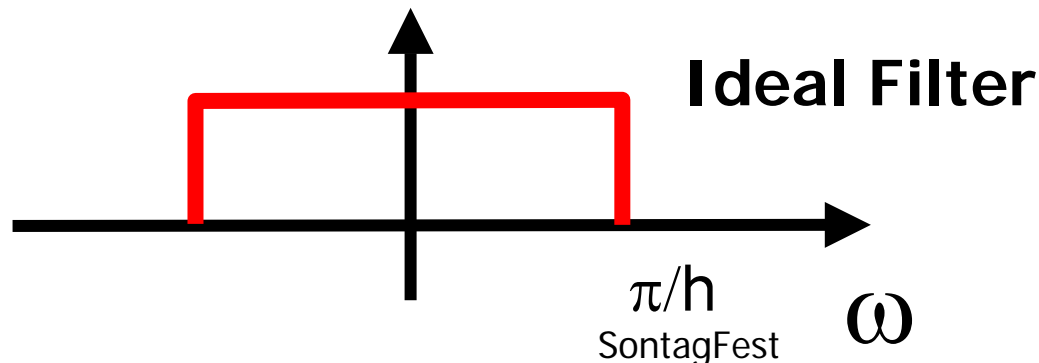
- Intersample information can be lost
- If no high-freq. components beyond the **Nyquist frequency** ( $= 1/2$  of sampling freq.)  $\rightarrow$  unique restoration  
 $\rightarrow$  Whittaker-Shannon-Someya sampling theorem

# Sampling Theorem

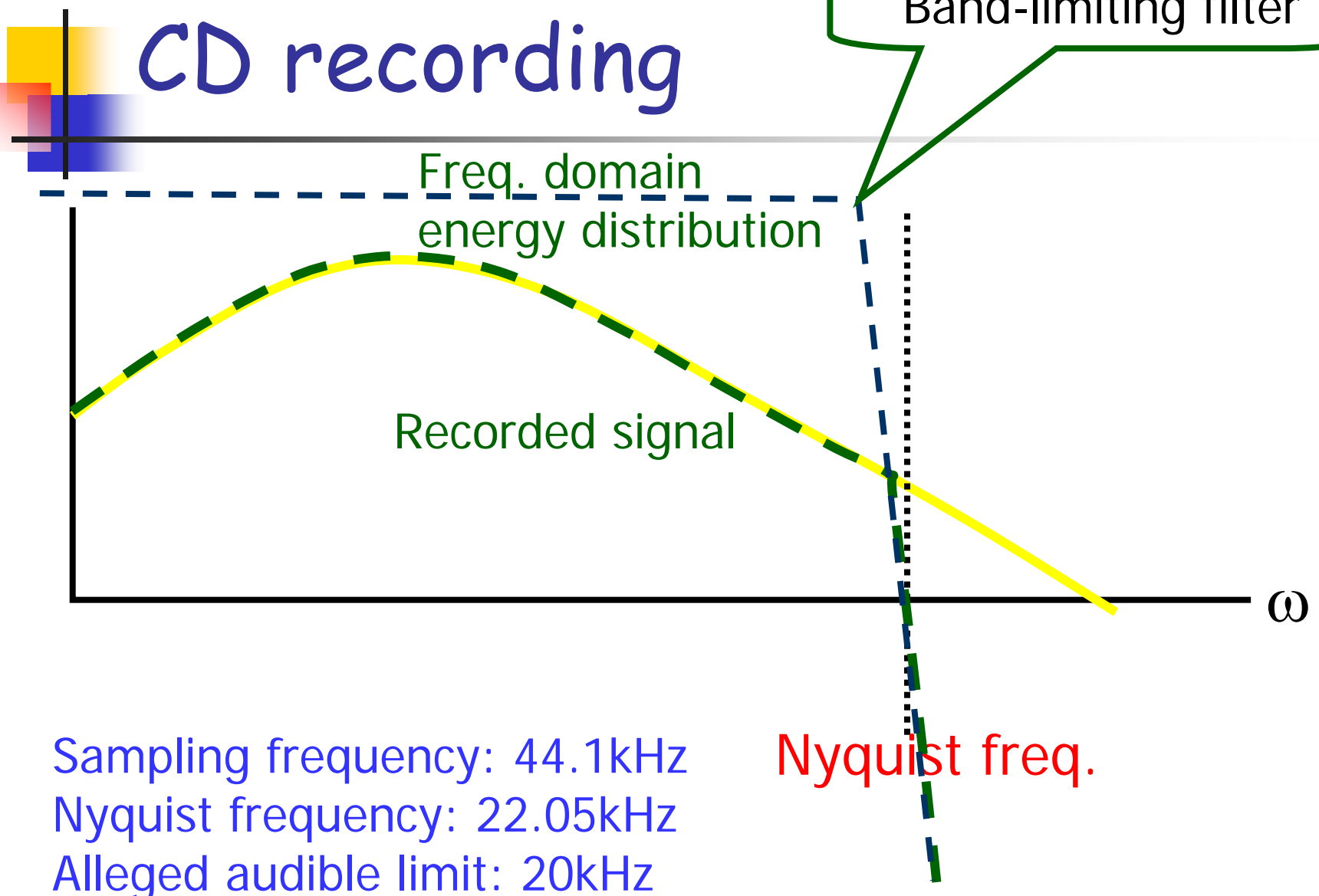
- Band limiting hypothesis  $\Rightarrow$  unique recovery

$$\hat{f}(j\omega) = 0 \text{ for } |\omega| > \pi/h \Rightarrow$$

$$f(t) = \sum_{n=-\infty}^{\infty} f(nh) \frac{\sin \pi(t/h - n)}{\pi(t/h - n)}$$

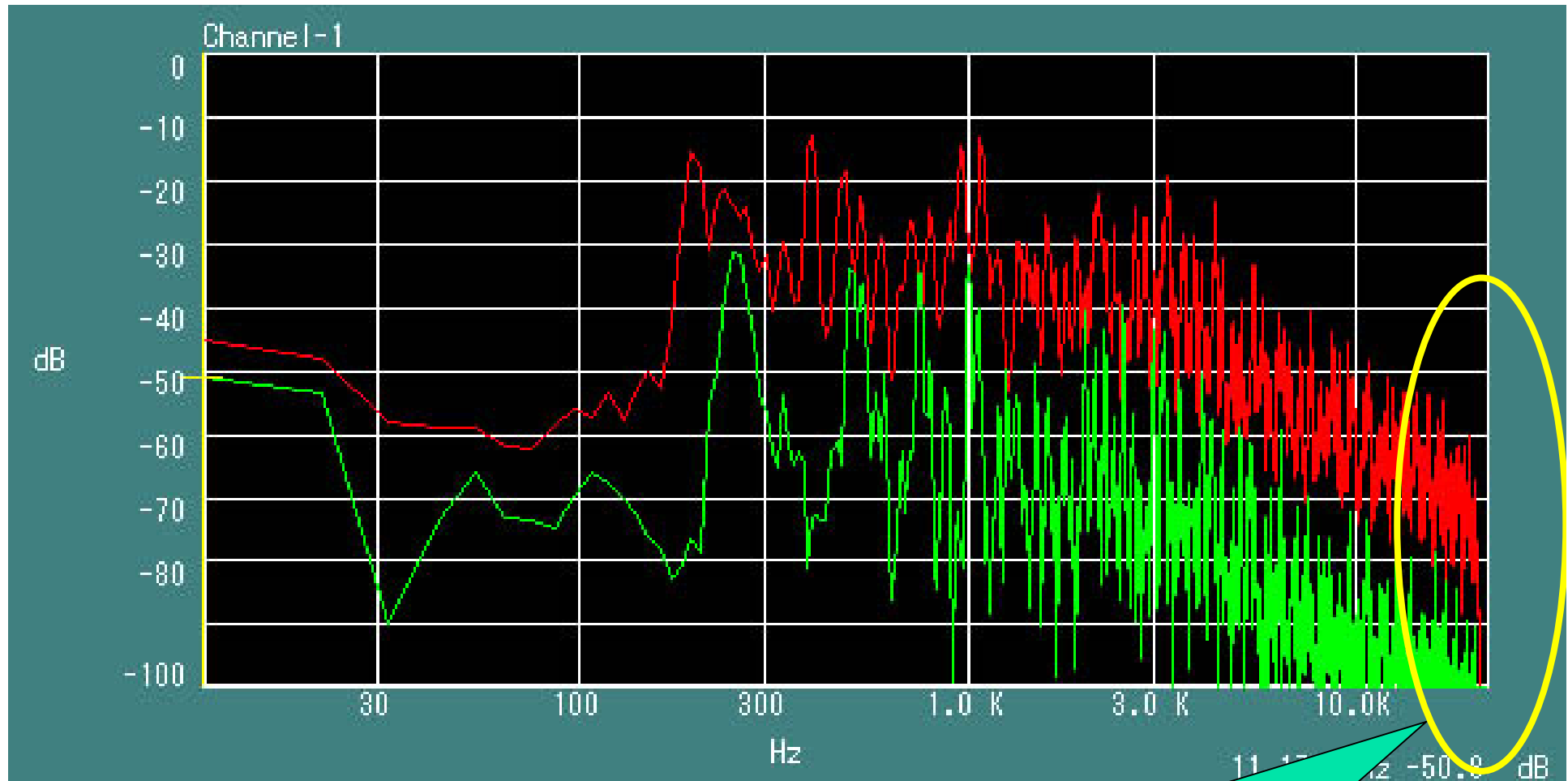


# CD recording



Sampling frequency: 44.1kHz  
Nyquist frequency: 22.05kHz  
Alleged audible limit: 20kHz

Digital Recording (CD): sharp anti-aliasing filter  
No signal components beyond 20kHz

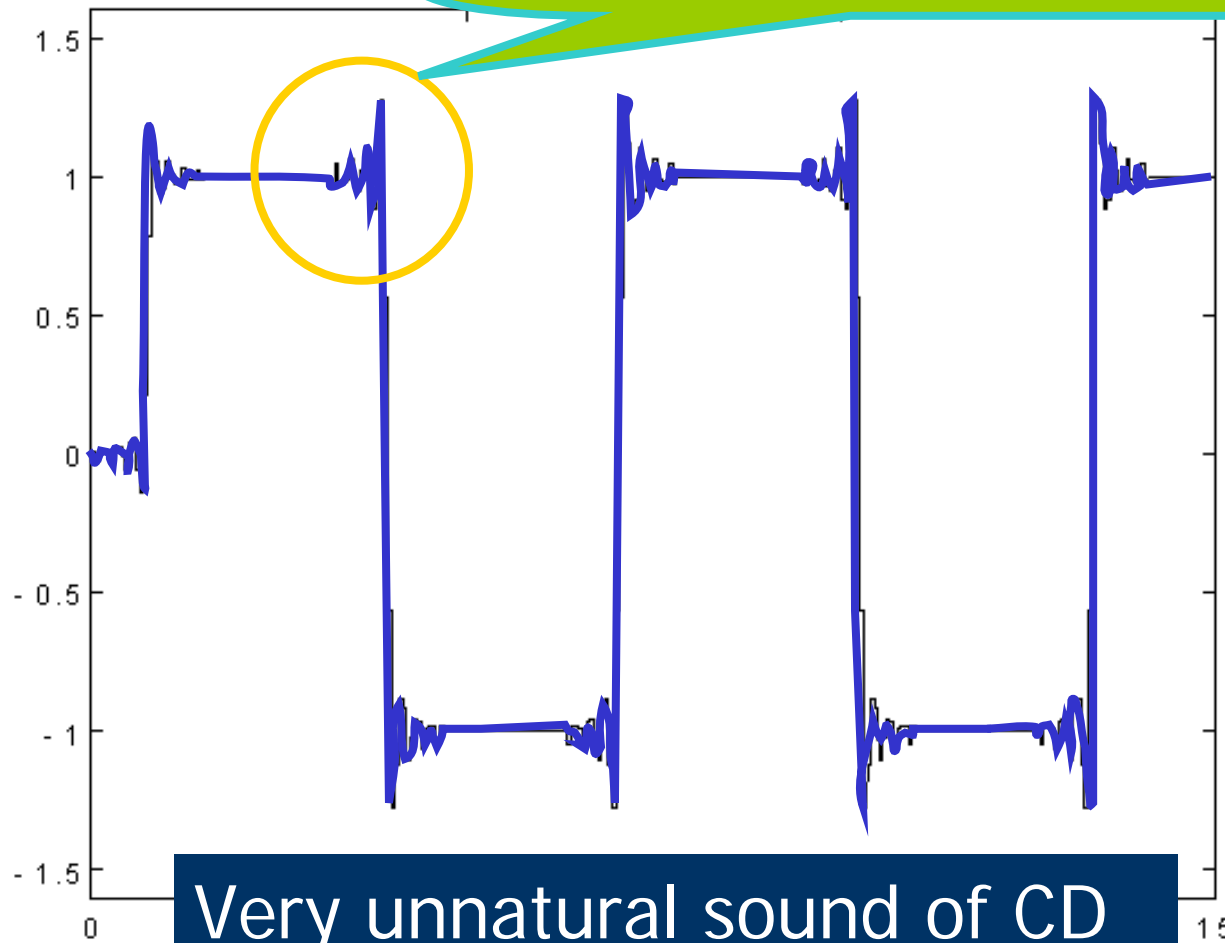


But you won't be able to hear them anyway??

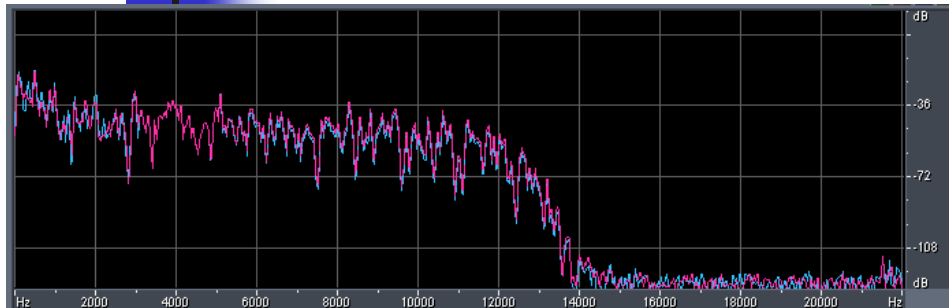
Very sharp anti-aliasing filter

# Effect of a band-limiting filter

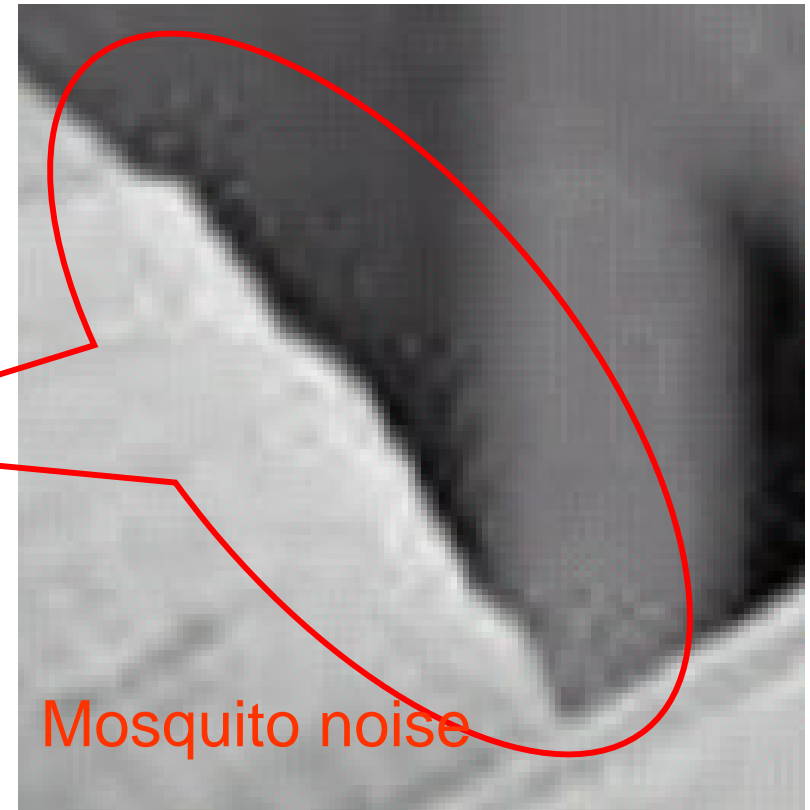
Big amount of ringing due to the Gibbs phenomenon

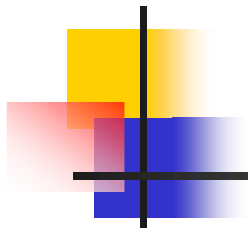


# Mosquito Noise-another Gibbs phenomenon



**Truncated freq. response**





What can we do?

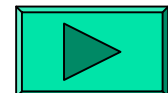
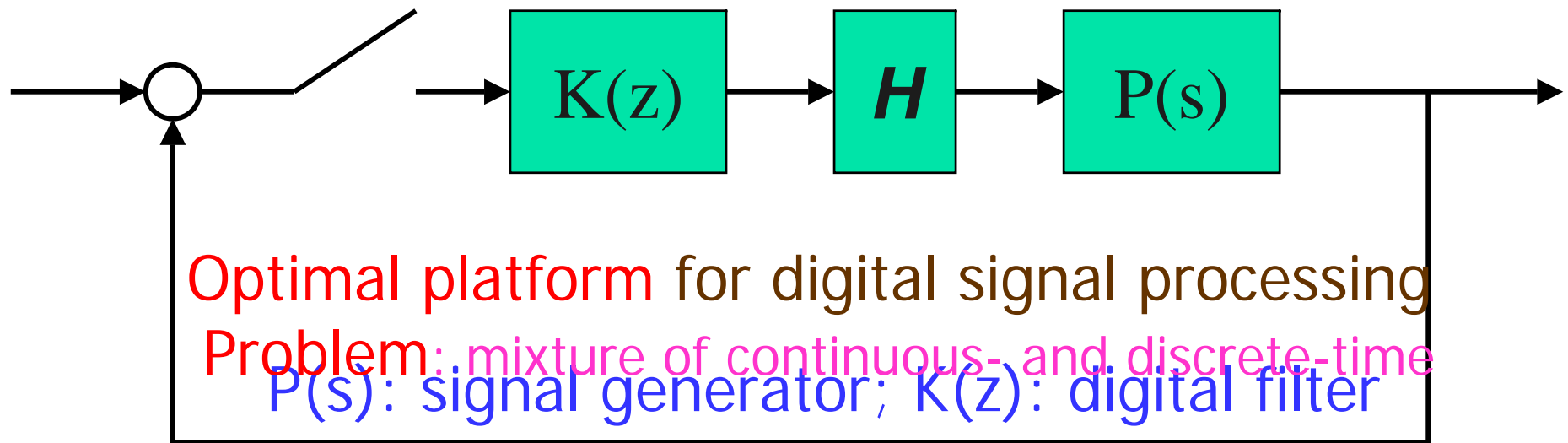


# Part II: Review of Sampled- data Control Theory



# Sampled-data Control Systems - What are they?

- Continuous-time plant
- Discrete-time controller
- sample/hold devices

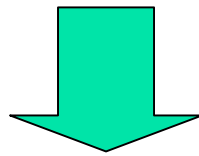




# Difficulties

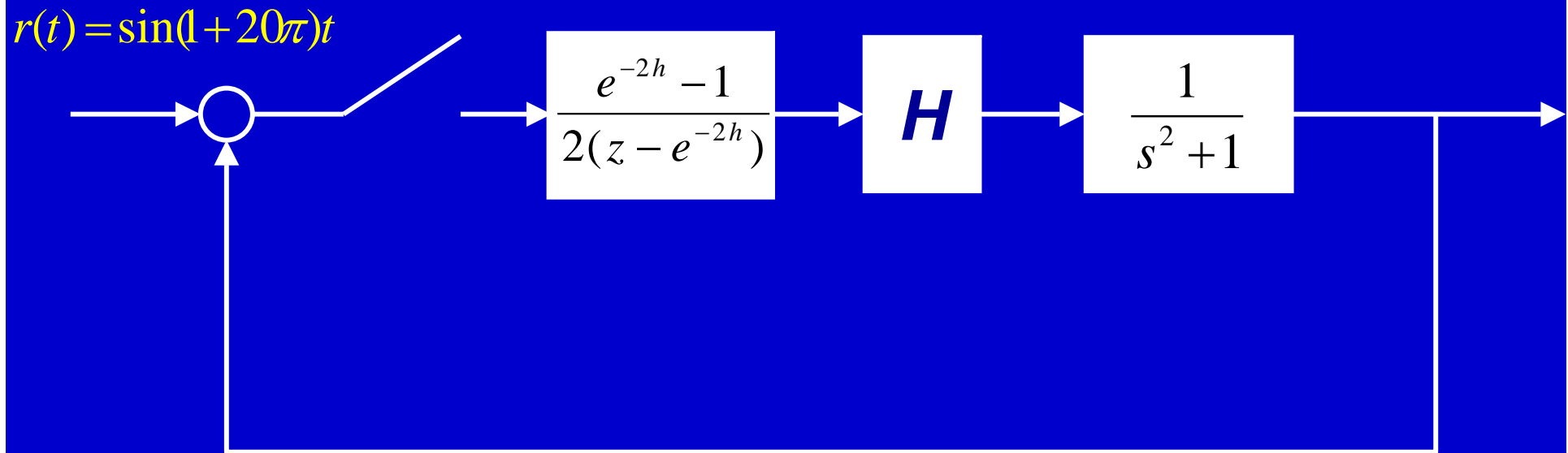
---

- Plant  $P(s)$  is continuous-time
- Controller  $K(z)$  is discrete-time
- The overall system is not **time-invariant**



- No transfer function
- No steady-state response
- No frequency response

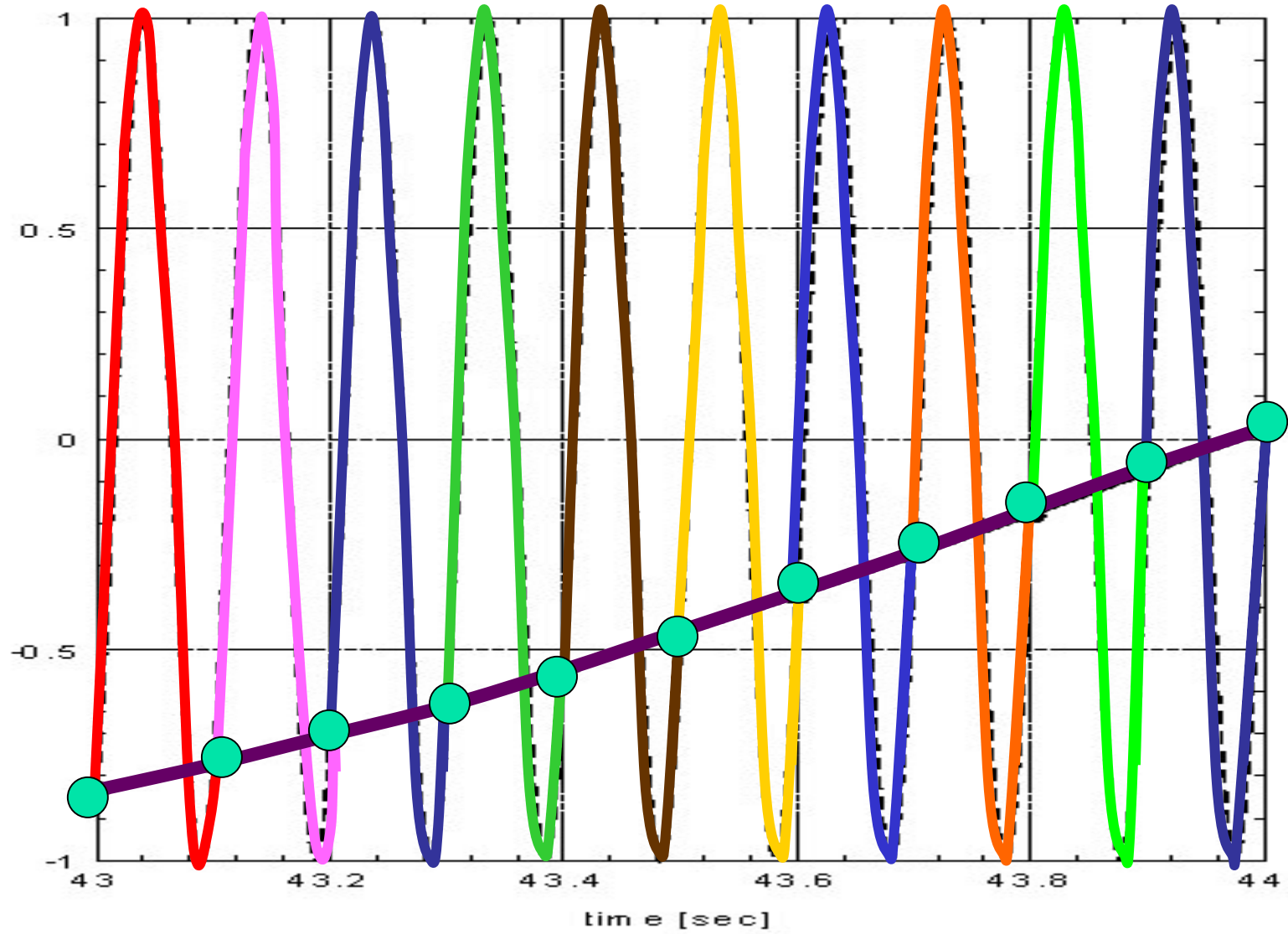
# Response against a sinusoid



# Response



$$v(\theta) = \sin(1 + 20\pi)\theta$$



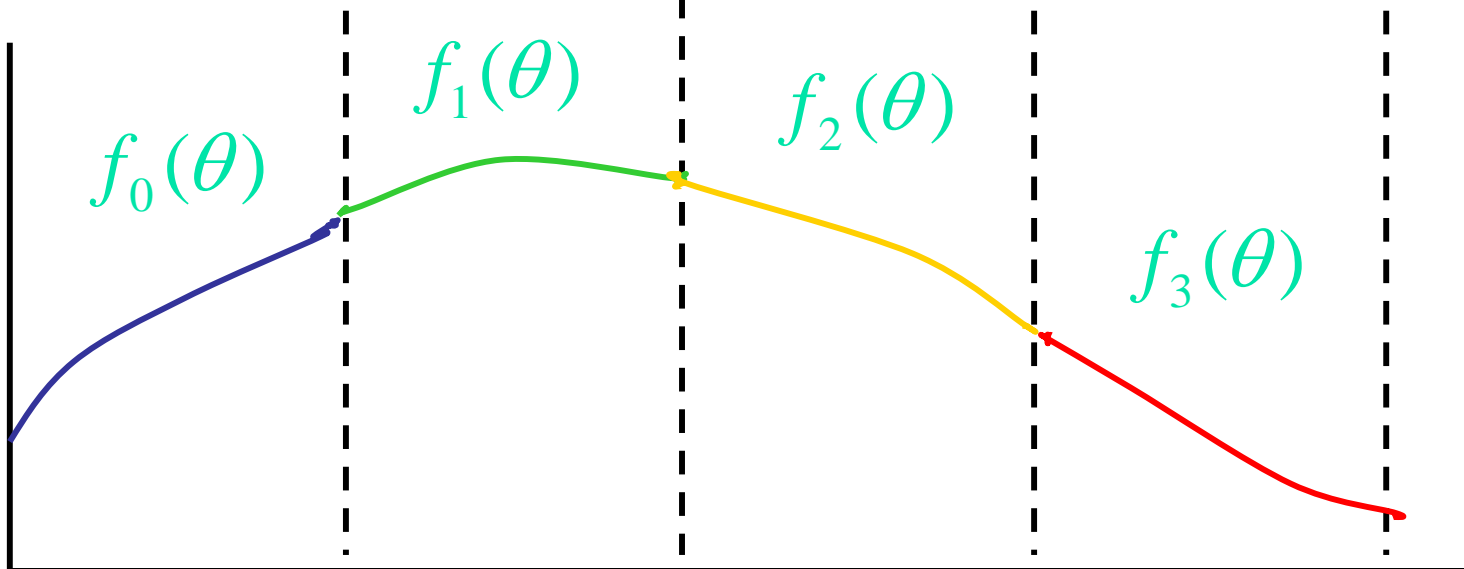
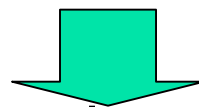
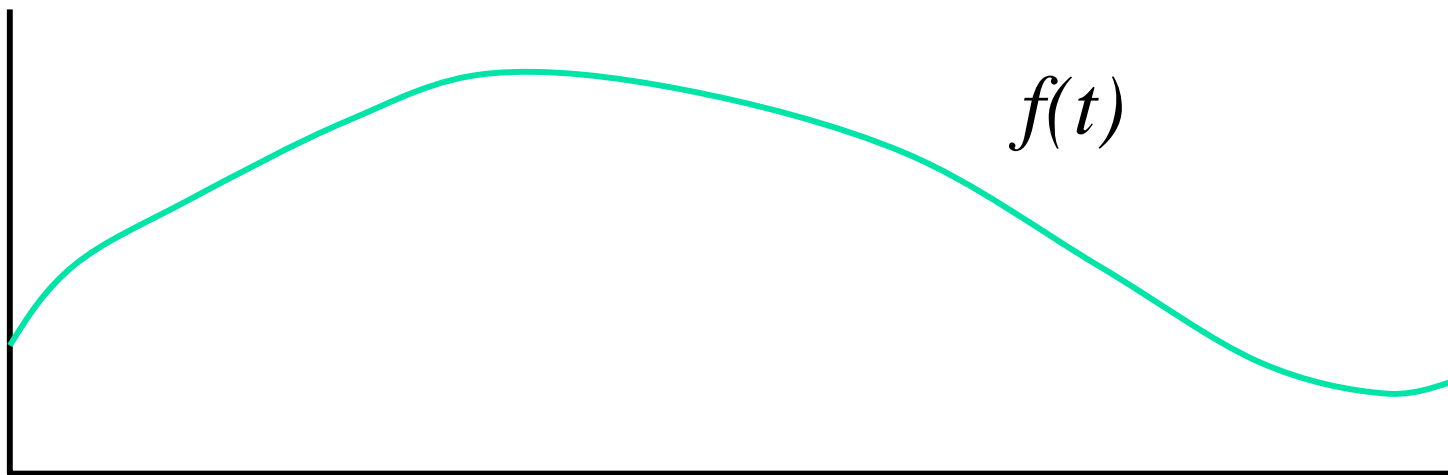


# What to do? & solutions

---

- A new technique: *lifting* (1990) that turns SD system to discrete-time LTI
- $\exists$  digital controller that makes cont.-time performance optimal

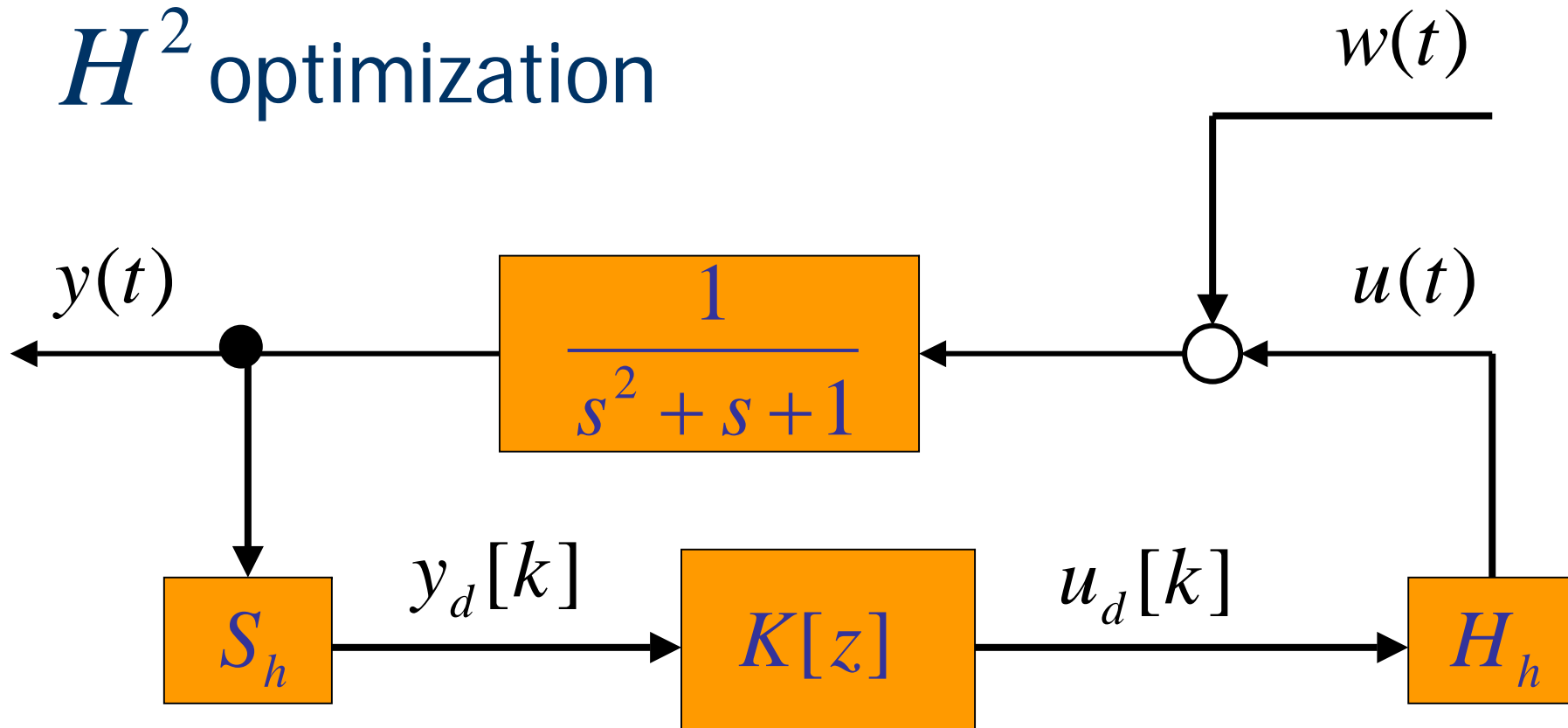
# Lifting of Functions



# Does this make a difference?

---Yes

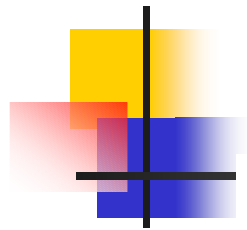
## $H^2$ optimization



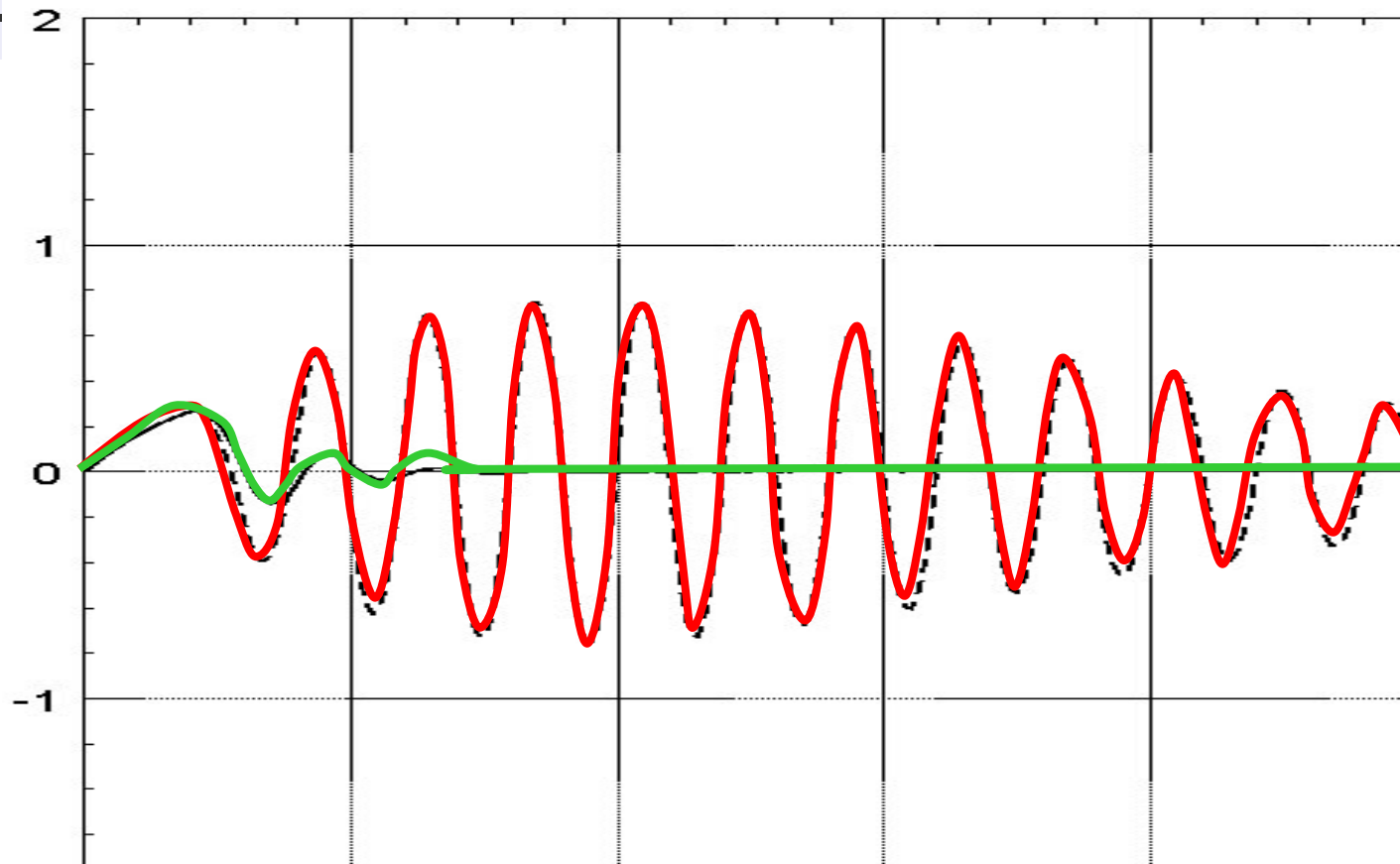
- a) Discrete-time  $H^2$  with no intersample consideration
- b) sampled-data design



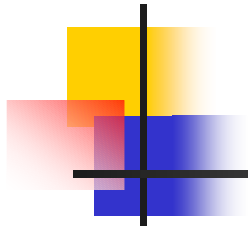
# Time Response



— Discrete-time H2 design  
— Sampled-data H2 design



- a) Discrete-time  $H^2$  with no intersample consideration
- b) sampled-data design



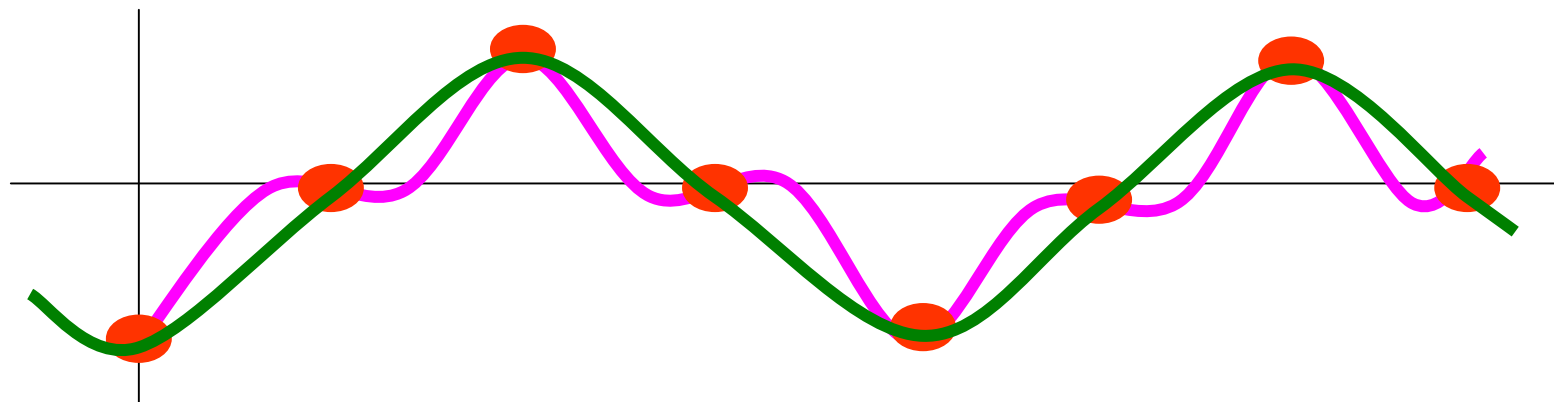
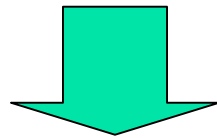
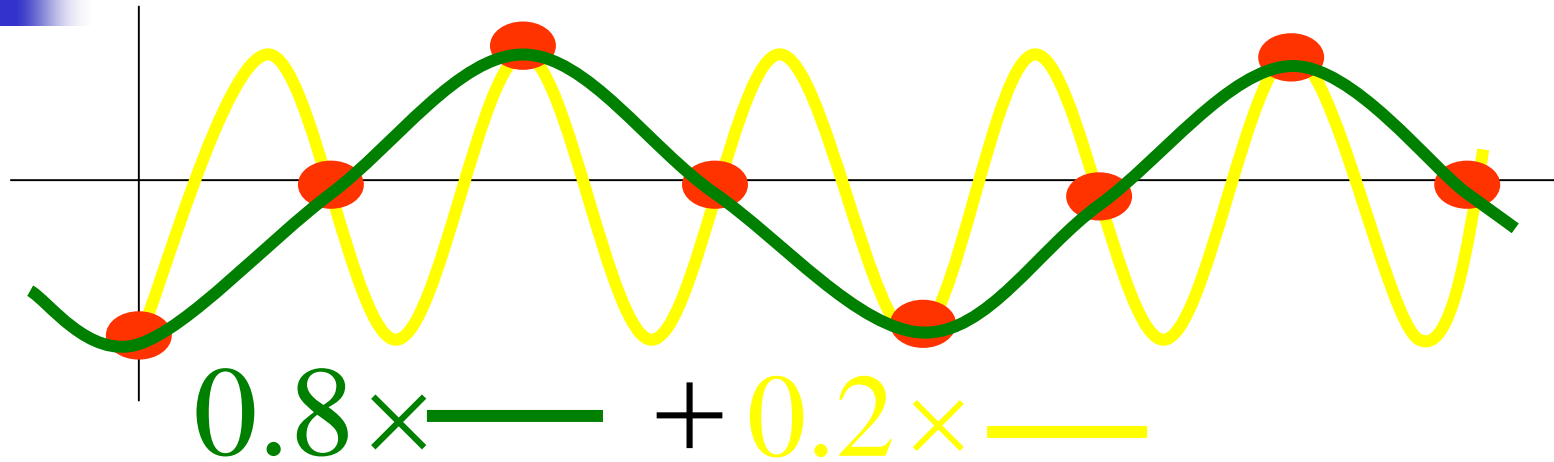
Can this be used for  
signal processing?



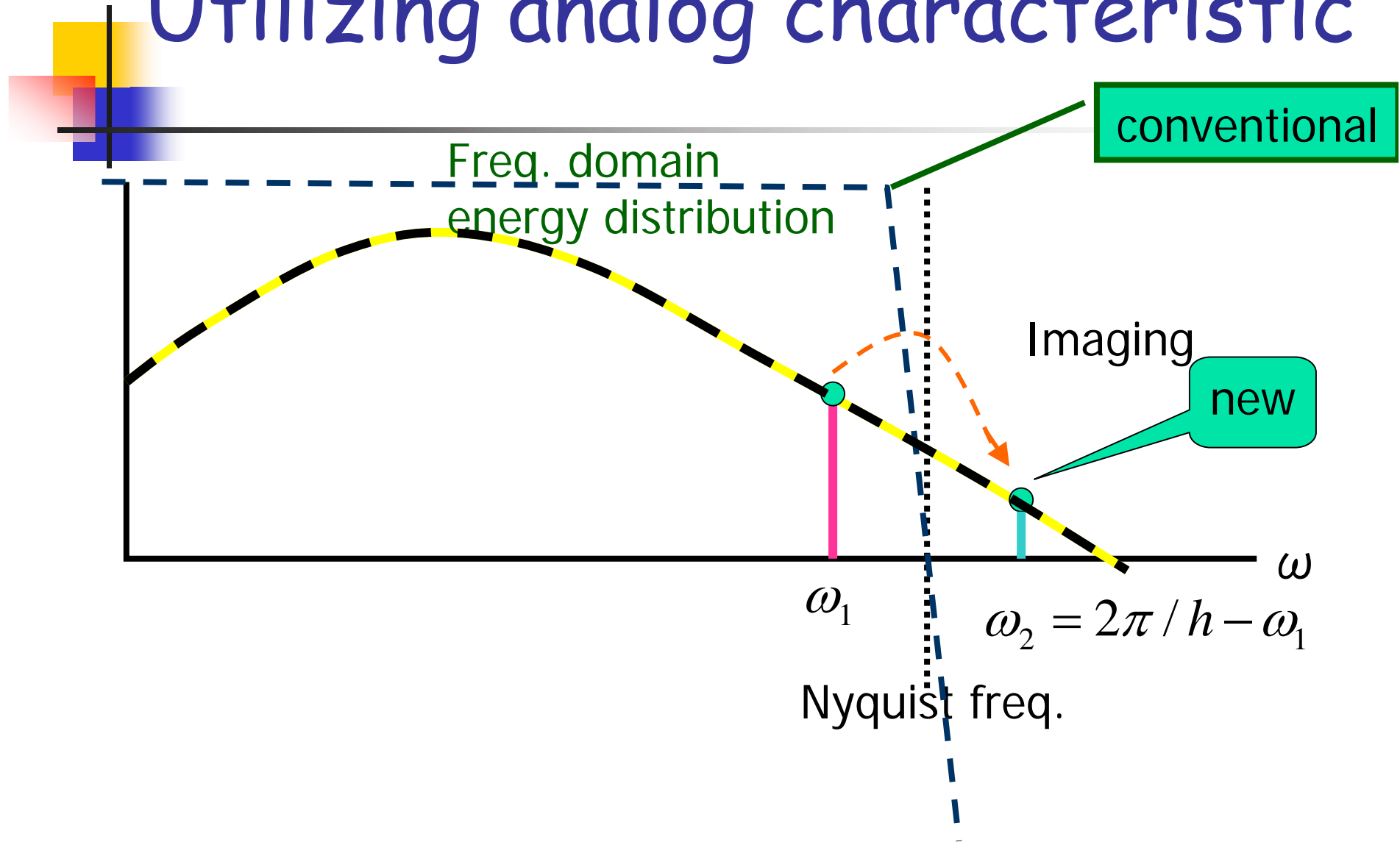
# Part III: How can sampled-data theory help?

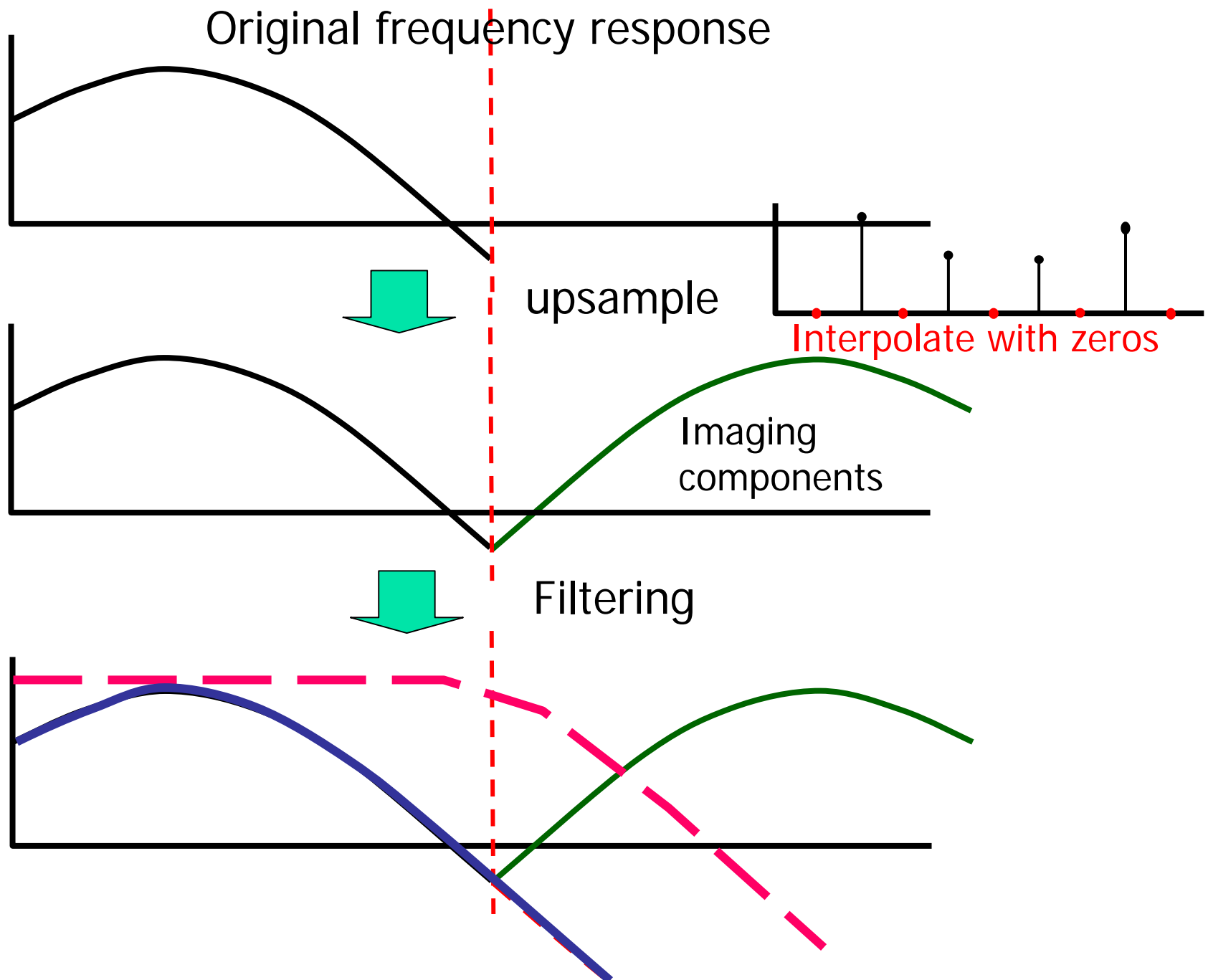
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# With a little bit of a priori information...

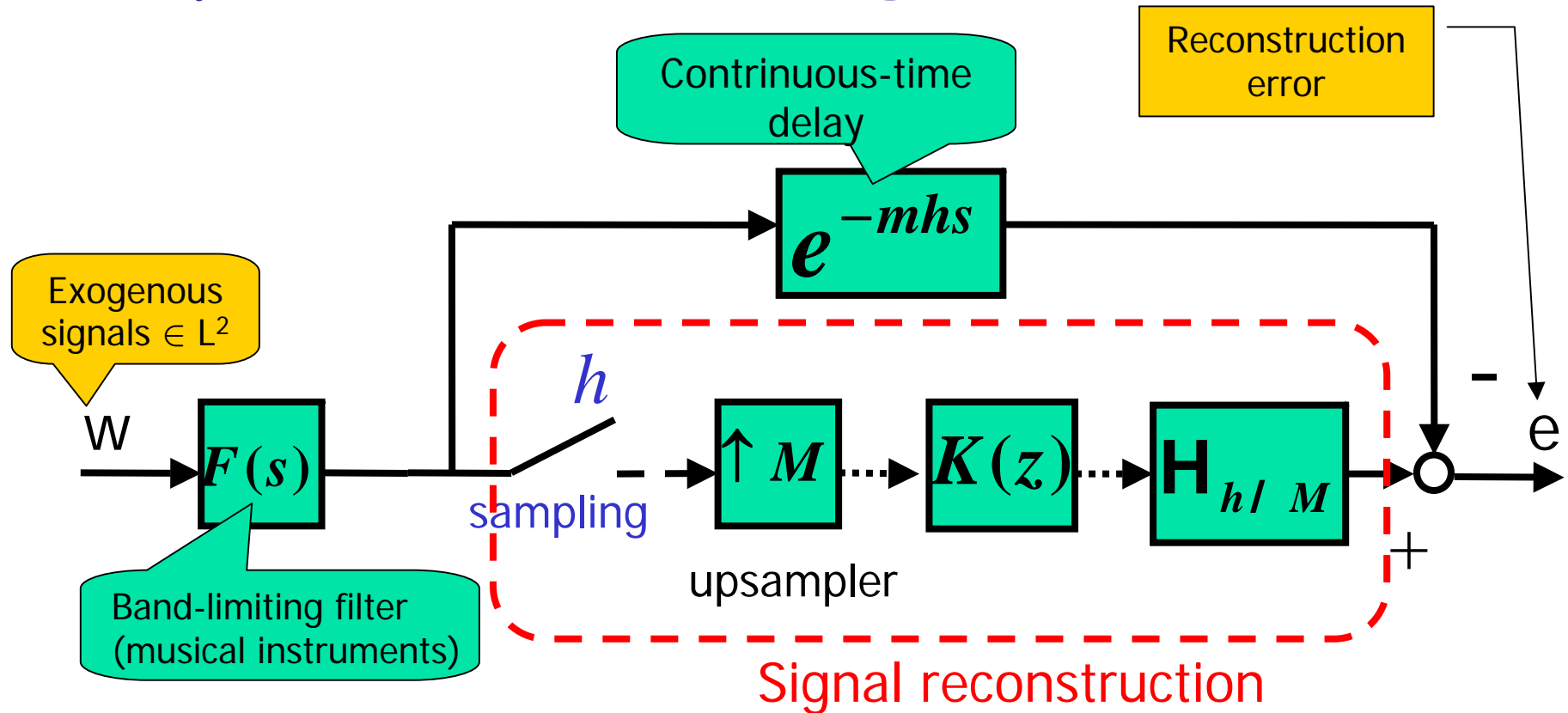


# Utilizing analog characteristic





# Sampled-data Design Model



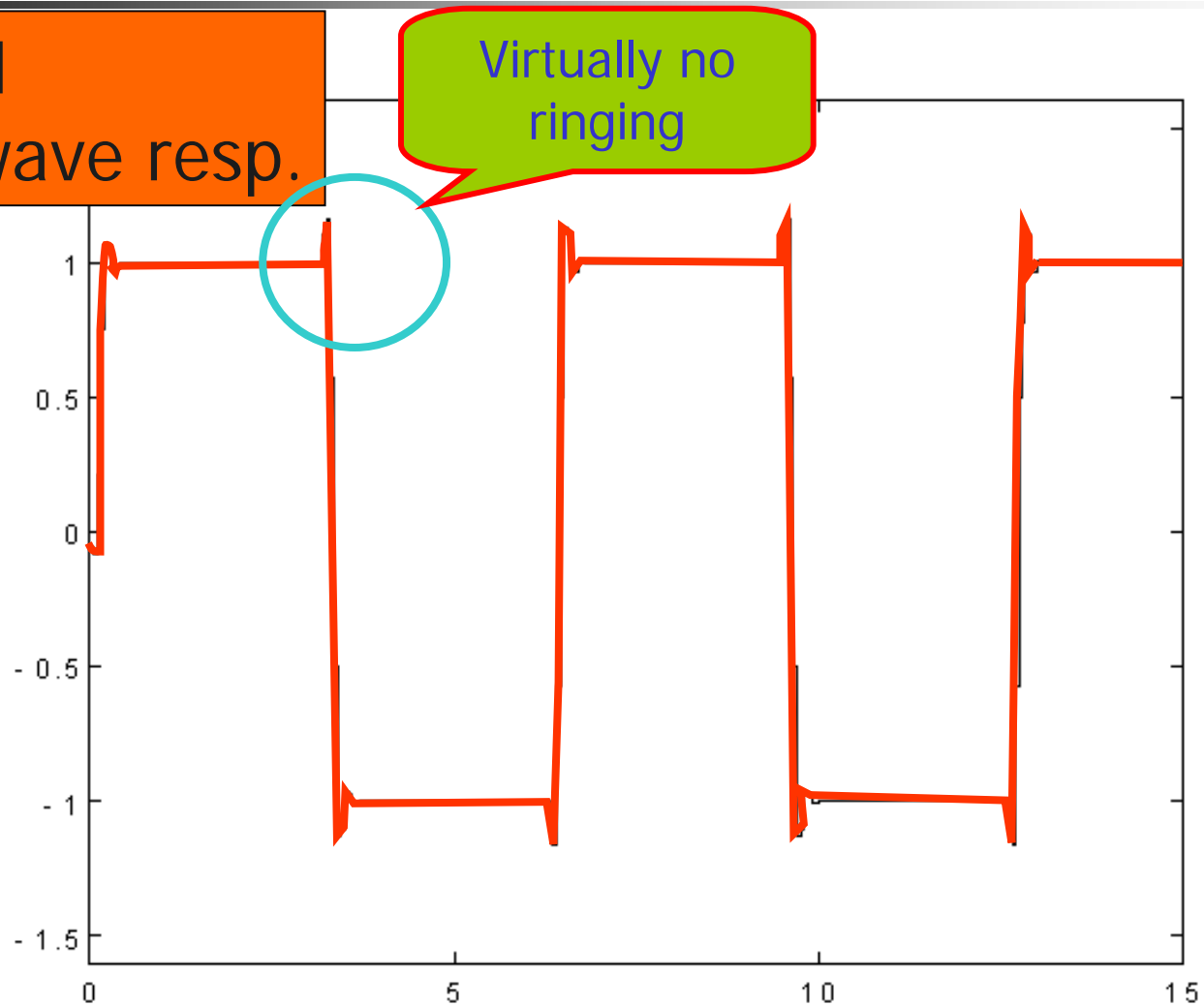
**Problem:** Find  $K[z]$  satisfying

$$\|T_{ew}\| < \gamma$$

Sampled-data  $H^\infty$  control problem

# Interpolator via the proposed method

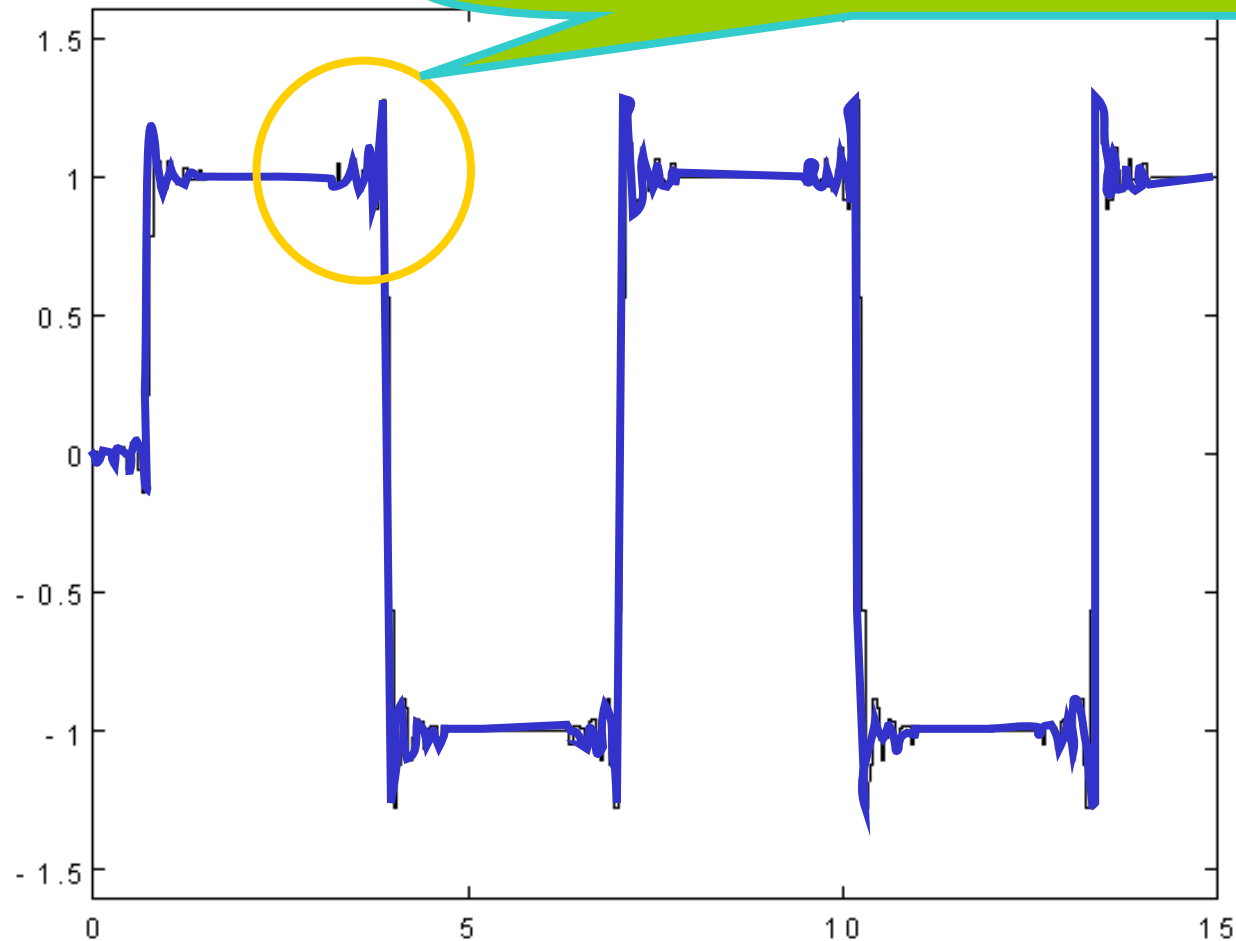
Proposed  
Square wave resp.





# Response of the Johnston filter

Big amount of ringing due to the Gibbs phenomenon





# Part IV: Application to Sound Restoration

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# Sound restoration

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アプリケーション



アプリケーション

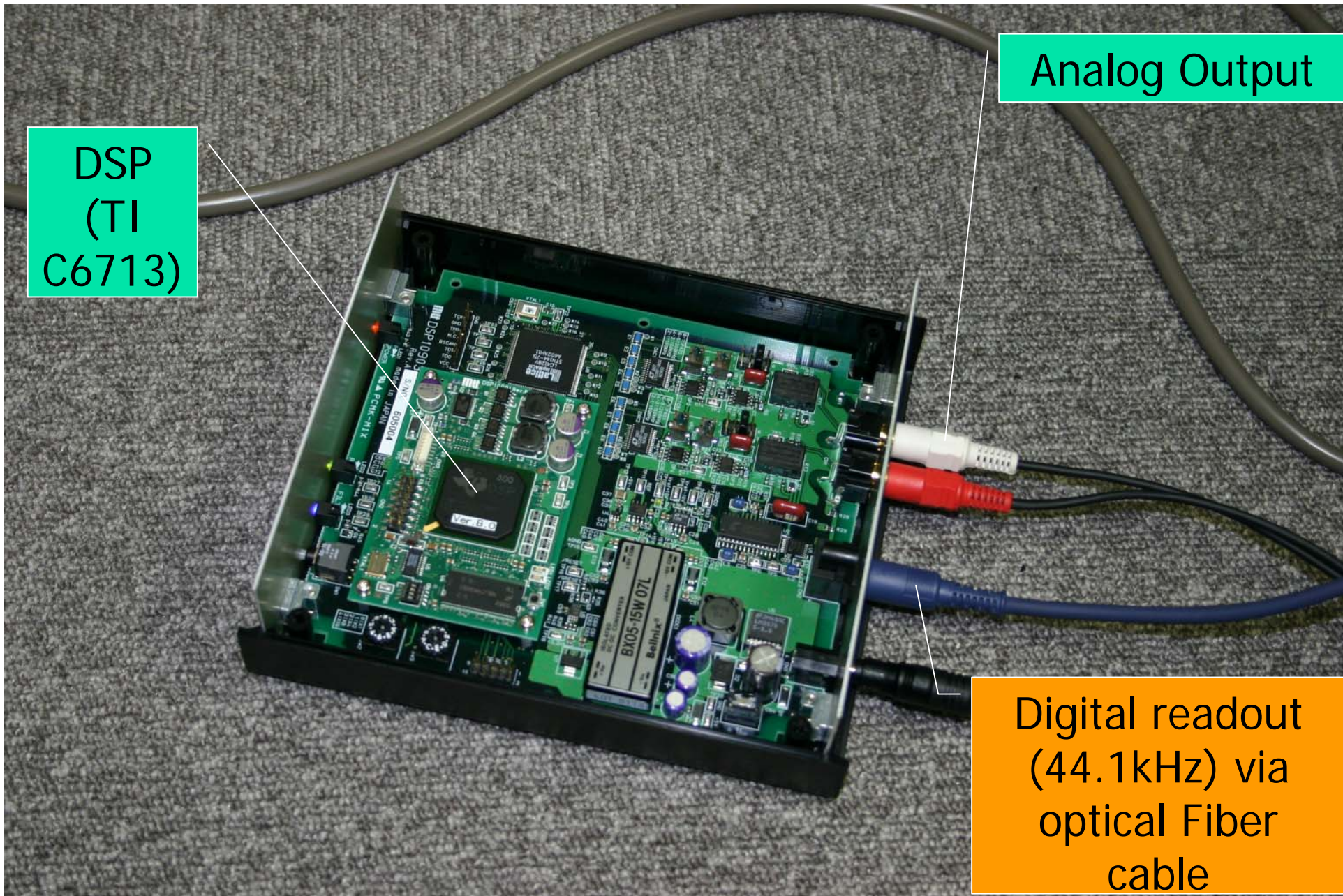
# YYLab



May 23, 2011

SontagFest

36



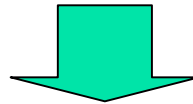
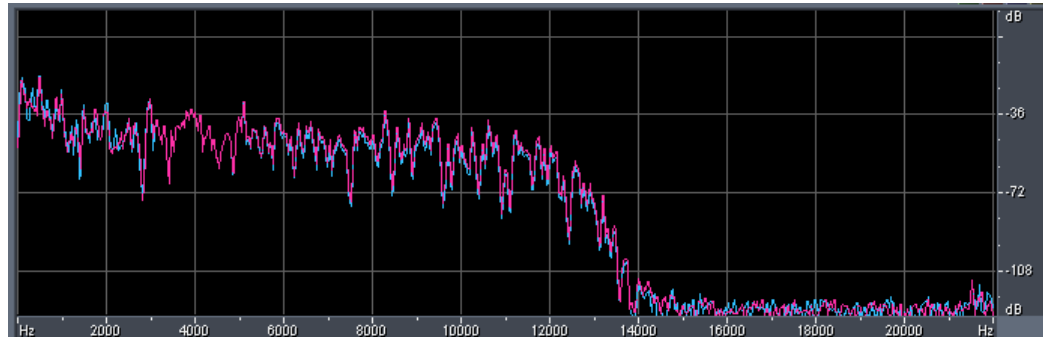
Analog Output

DSP  
(TI  
C6713)

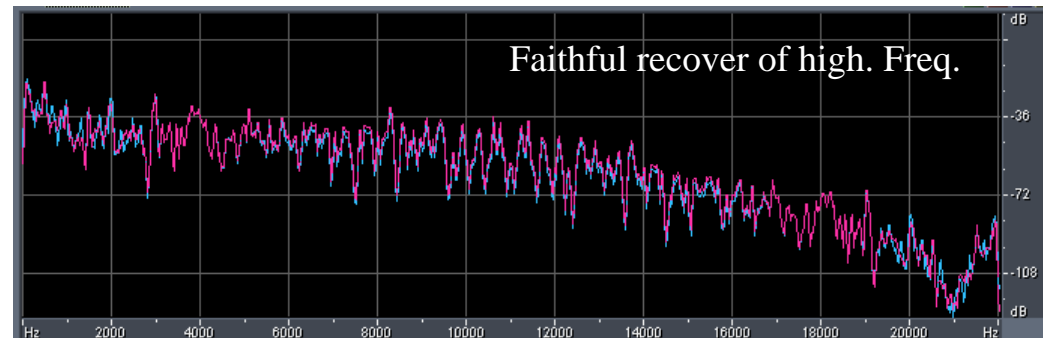
Digital readout  
(44.1kHz) via  
optical Fiber  
cable

## Example in MD(mini disk) players

MDLP4(66kbps)



**After** “YY”



More natural high  
freq. response

By the courtesy of  
SANYO Corporation

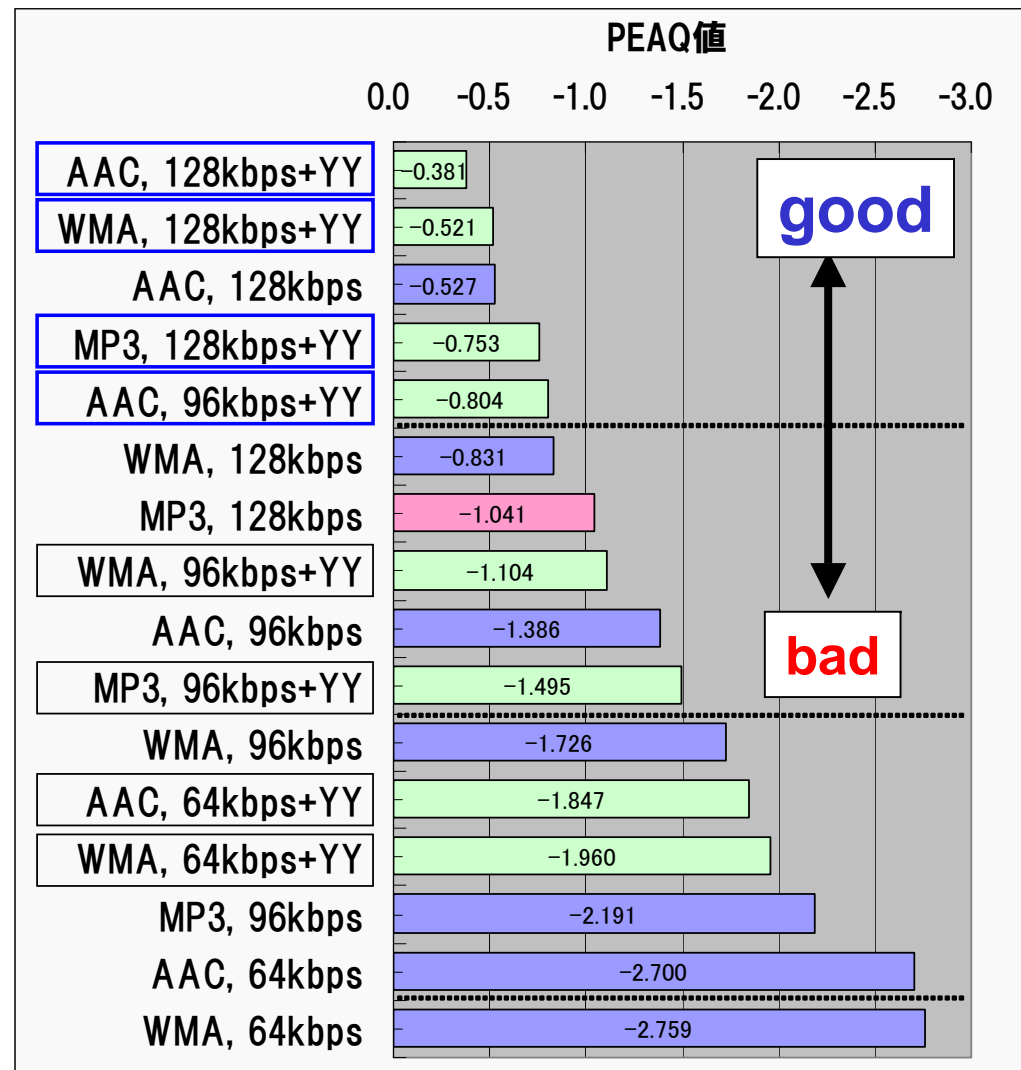
This “YY filter” is implemented in custom LSI sound chips by SANYO Coop., and being used in MP 3 players, mobile phones, voice recorders. The cumulative sale has reached over 20 million units.

# Effect evaluation on compressed audio via PEAQ program

- Tested on 100 compressed music sources via PEAQ (Perceptual Evaluation of Audio Quality)
- PEAQ values:
  - 0...indistinguishable from CD
  - 1...distinguishable but does not bother the listener
  - 2...not disturbing
  - 3...disturbing
  - 4...very disturbing
- Note how YY improves the sound quality

<http://en.wikipedia.org/wiki/PEAQ>

By the courtesy of SANYO corporation



Compression formats: MP3, AAC, WMA  
Bitrates: 64kbps, 96kbps, 128kbps  
Showing average values

# Part V: Application to Images



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# Same Problems as Sounds

---

- Block and Mosquito noise
- Lack of sufficient bandwidth
- Mosquito noise – Gibbs phenomenon
- Can sampled-data filter help?



Original



↓ 2 downsample  
and hold



Interpolation  
Via equiripple  
filter



YYa

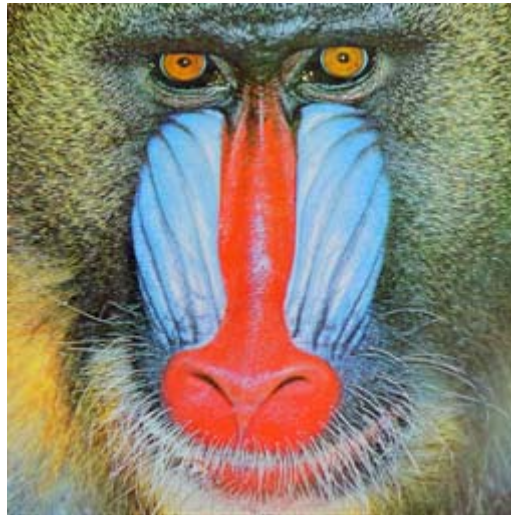


SontagFest

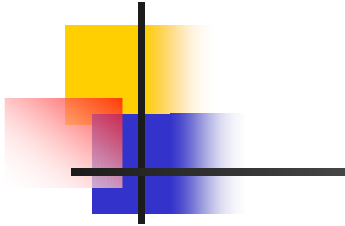
4times  
upsample+  
twice  
downsample  
via YY



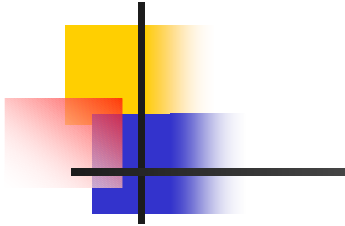
Another application:  
How can we zoom “digitally”?



# Interpolation via bicubic filter



# Interpolation via sampled-data filter





# Summarizing

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- Analog signal generator model
- Error frequency response to be minimized (doesn't exist in the conventional approach)
- $\Leftarrow$  sampled-data  $H^\infty$  control

Happy Birthday



May 23, 2011