

# İşaret İşleme

## Örnekleme Teoremi-H13CD1

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# Örnekleme-Sampling

- Örnekleme;
  - sürekli zamanlı sinyalleri işlemek,
  - kaydetmek,
  - iletmek,
  - saklamak ve
  - almak için modern dijital elektroniklerin kullanılmasına izin verir.
- Neden sinyaller hakkında düşünmek isteyebilirsiniz ki ?

# Örnekleme-Sampling

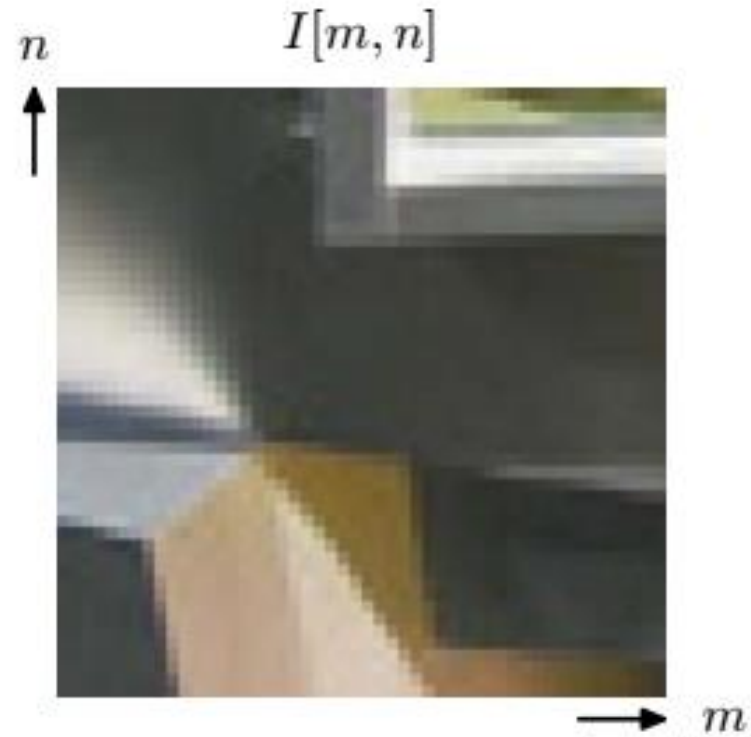
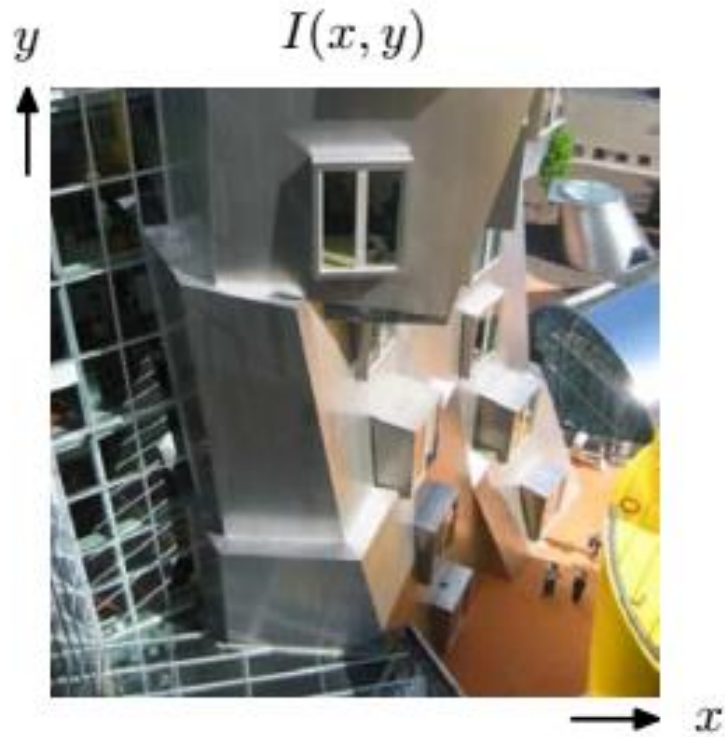
- Neden sinyaller hakkında düşünmek isteyebilirsiniz ki ?
  - Ses: MP3, CD, hücresel telefon,..
  - Resim: dijital kamera, yazıcı,..
  - Video: DVD,..
  - Web üzerindeki her şey yüzünden

## Sampling

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Sampling is pervasive.

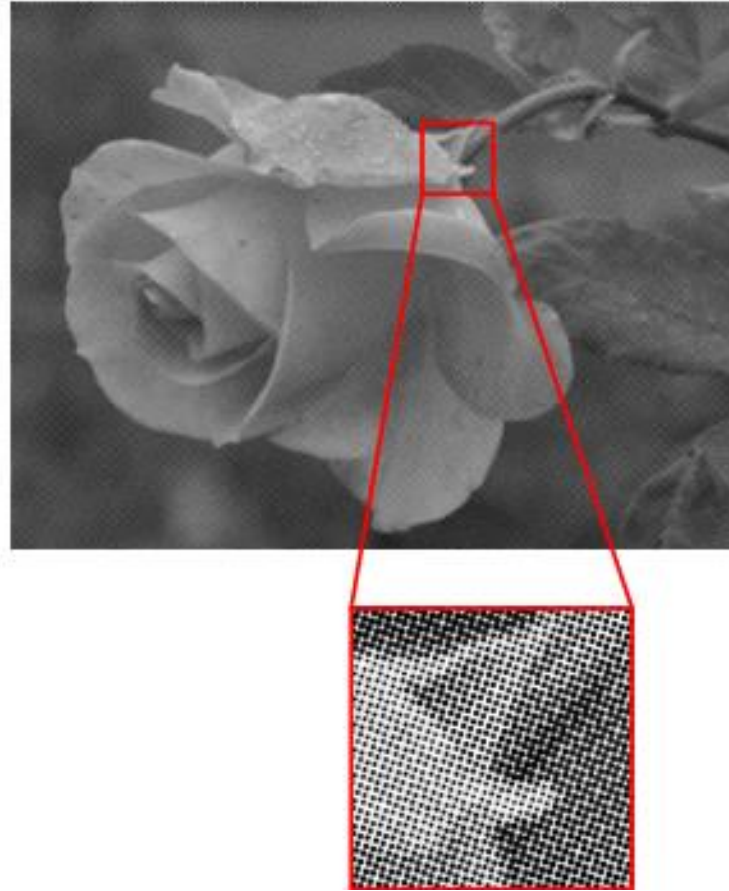
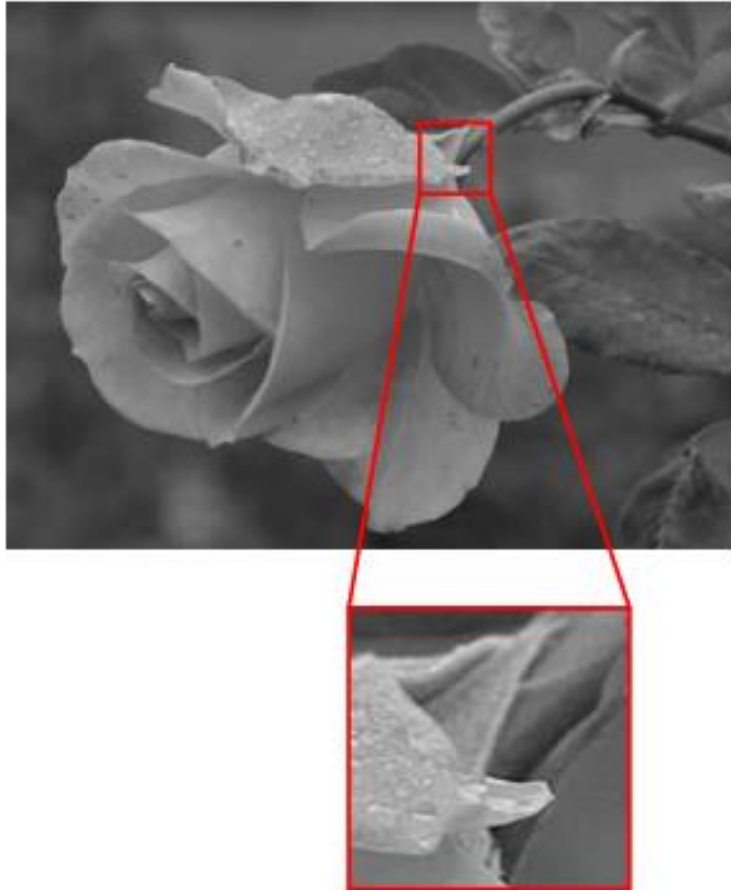
Example: digital cameras record sampled images.



## Sampling

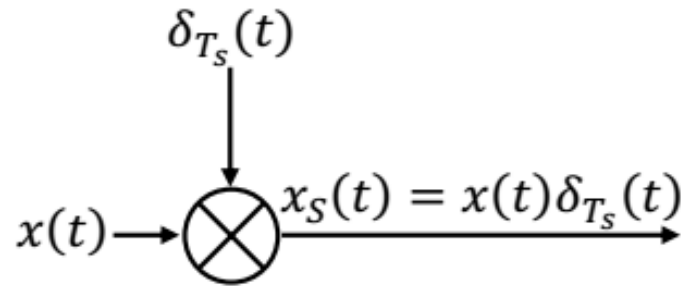
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Zoom in to see the binary pattern.

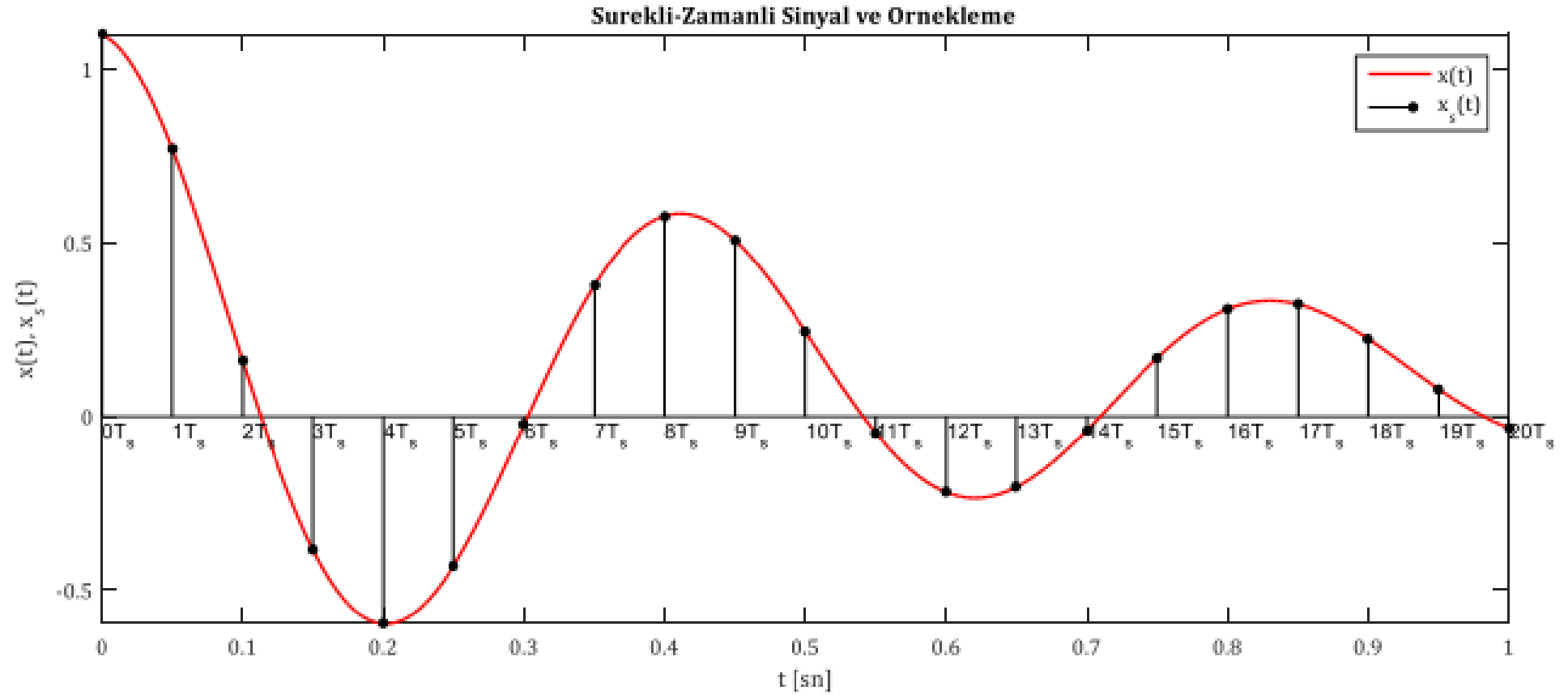


# Örnekleme

Örnekleme, dijital sinyal işlemenin temelini oluşturan bir işlem olup zaman domenindeki  $w_B$  gibi sonlu bant genişlikli sürekli-zamanlı bir sinyalin  $T_s$  periyotlu  $\delta_{T_s}(t)$  darbe katarı çarpılarak ayrık-zamanlı hale getirilmesini ve bu sayede dijital sinyal işlemeye uygun hale getirilmesini sağlar. Bunu aşağıdaki şekilde görmek mümkündür.



Aşağıdaki şekilde tipik bir örneklenmiş sinyal görülmektedir.



Örnekleme işlemi sonucunda elde edilen örneklenmiş sinyalin Fourier dönüşümünün bulunmasında, Fourier dönüşümünün

$$x_1(t)x_2(t) \leftrightarrow \frac{1}{2\pi} X_1(w) * X_2(w)$$

şeklindeki çarpma özelliğinden yararlanılır. Örneklenecek  $x(t)$  sinyali ile  $T_s$  periyotlu  $\delta_{T_s}(t)$  darbe katarı sinyalinin çarpılması ile elde edilen örneklenmiş  $x_s(t)$  sinyalinin Fourier dönüşümü, çarpma özelliğine göre şu şekilde bulunur:

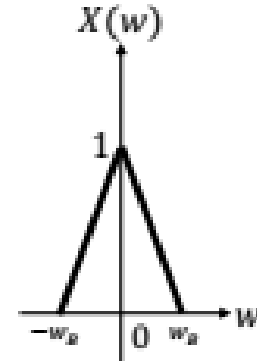
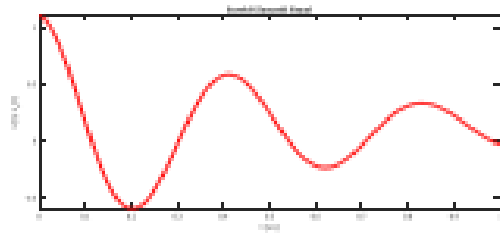
$$\begin{aligned} x_s(t) = x(t)\delta_{T_s}(t) &\leftrightarrow \frac{1}{2\pi} X(w) * \mathcal{F}\{\delta_{T_s}(t)\} = \frac{1}{2\pi} X(w) * w_s \sum_{k=-\infty}^{\infty} \delta(w - kw_s) \\ &= \frac{1}{T_s} \sum_{k=-\infty}^{\infty} X(w - kw_s) \end{aligned}$$

Görüldüğü gibi örneklenmiş sinyalin Fourier dönüşümü, orjinal sinyalin Fourier dönüşümünün tüm frekans domenine yayılmış hali gibidir. Bu durum aşağıdaki şekilde görülmektedir.



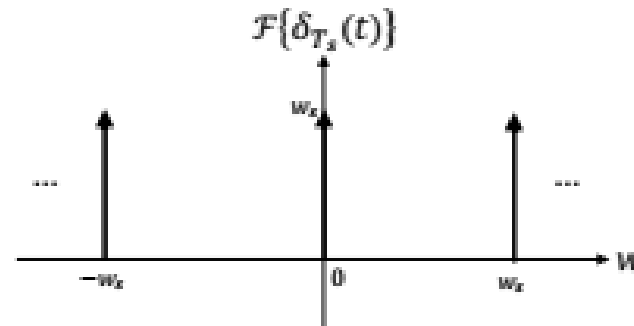
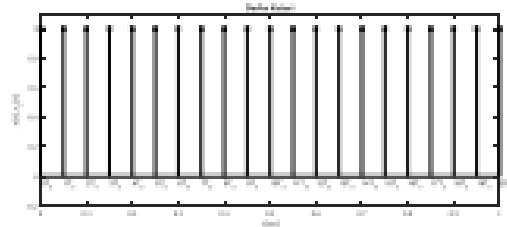
*zaman domeni*

*frekans domeni*



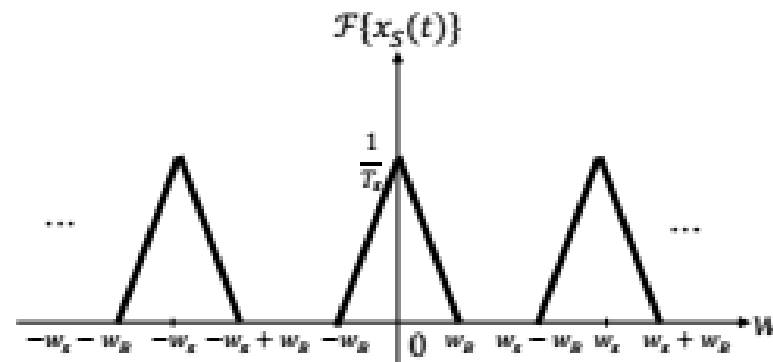
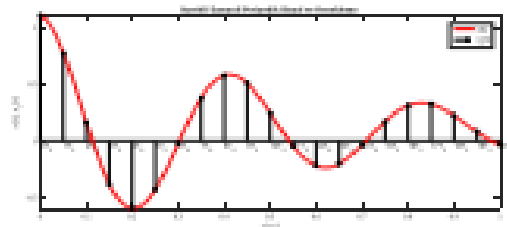
**X**

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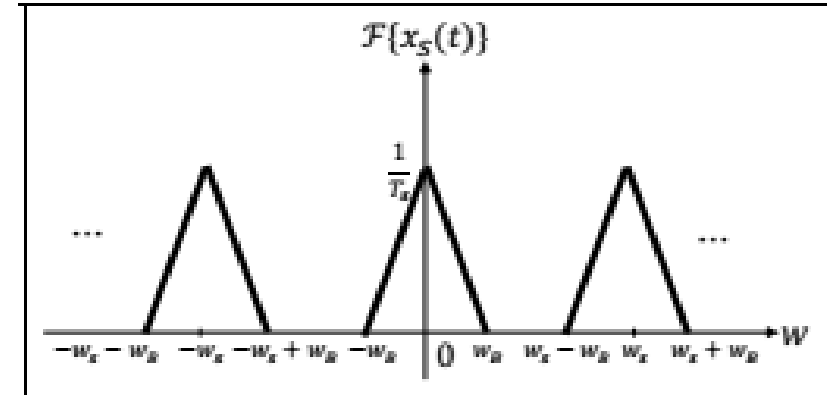



**=**

**=**



Burada en önemli soru  $T_s$  periyodunun nasıl seçileceğidir. Şekle bakıldığında, Fourier dönüşümleri arasında bir girişim ya da örtüşmenin olmaması için



  $\omega_B < 2\omega_s$

şartının sağlanması gerekir ki bu da örnekleme teoreminin en önemli sonuçlarından biridir. Buna göre, örnekleme frekansı, örneklenecek sinyalin bant genişliğinin en az iki katı olmalıdır.

# Örnekleme Teoremi (Sampling)

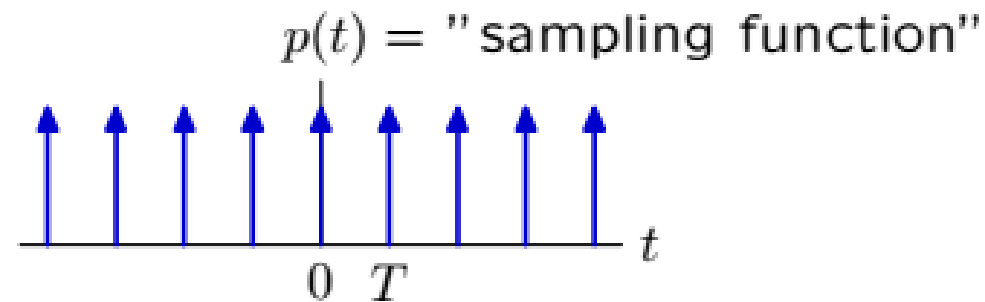
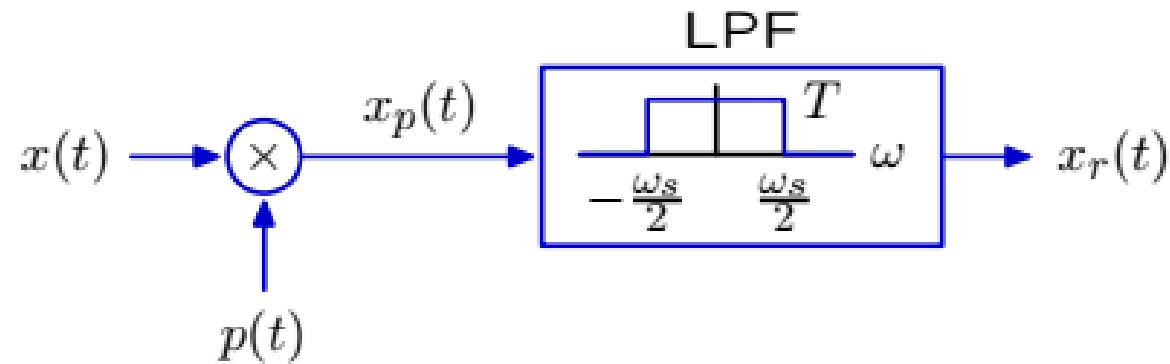


Boş bir zamanda izleyin..

<https://www.youtube.com/watch?v=1El4znkRH0g>

## CT Model of Sampling and Reconstruction

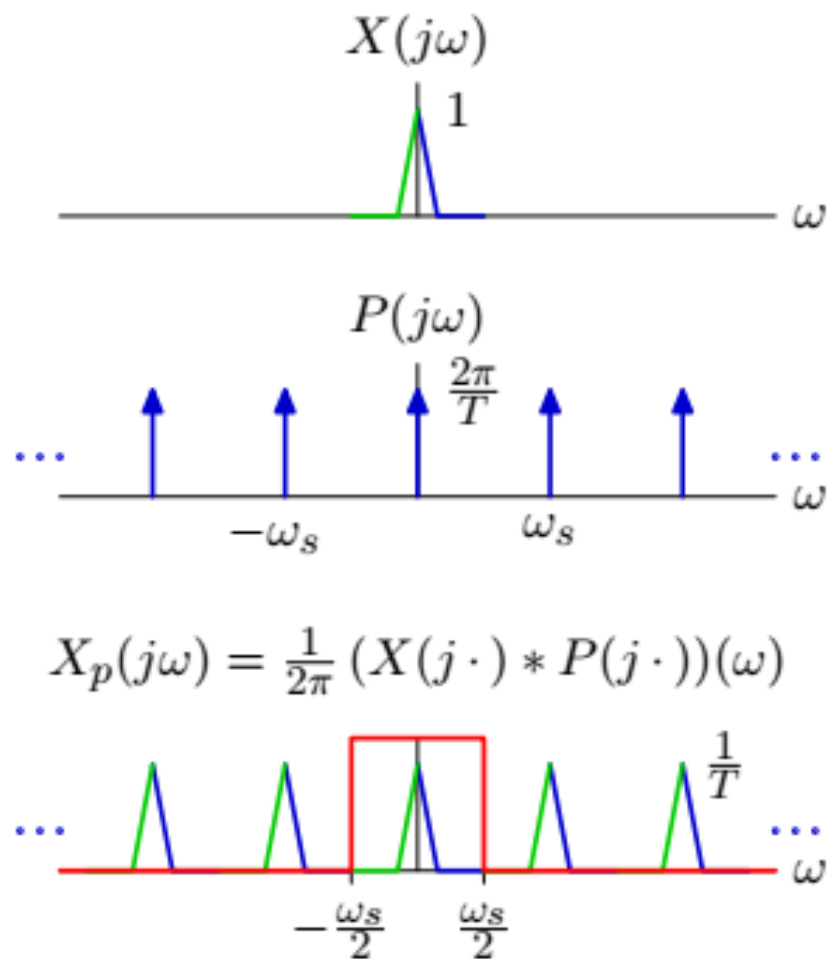
Sampling followed by bandlimited reconstruction is equivalent to multiplying by an impulse train and then low-pass filtering.



## Aliasing

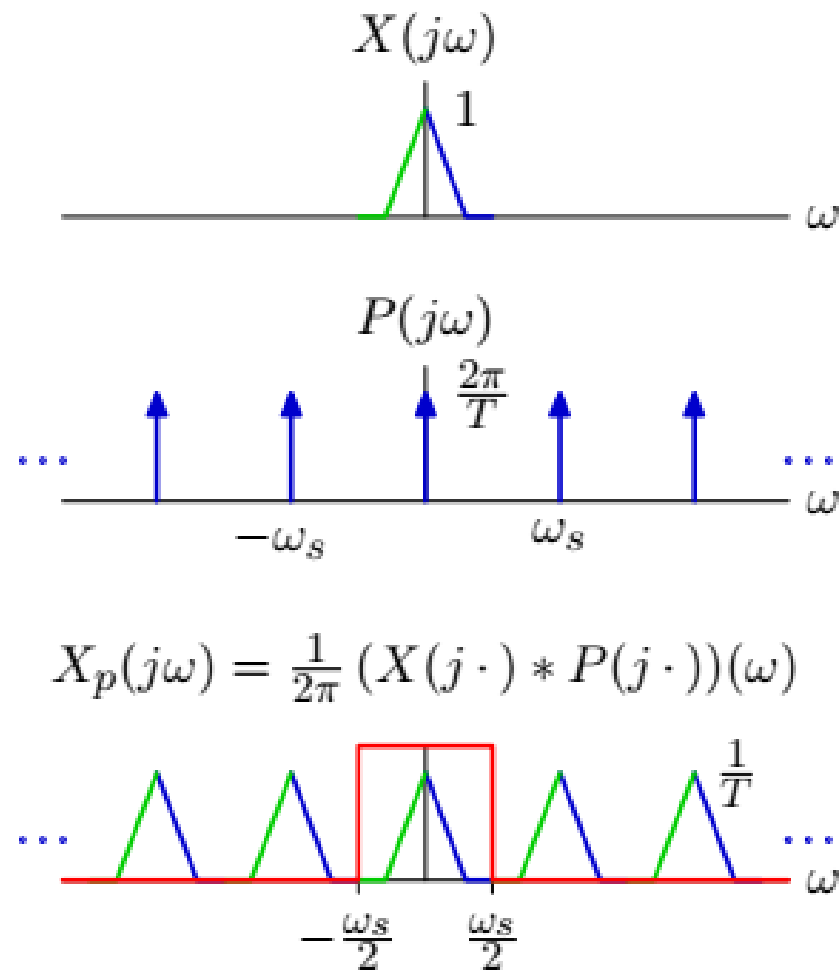
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High frequency components of complex signals also wrap.



## Aliasing

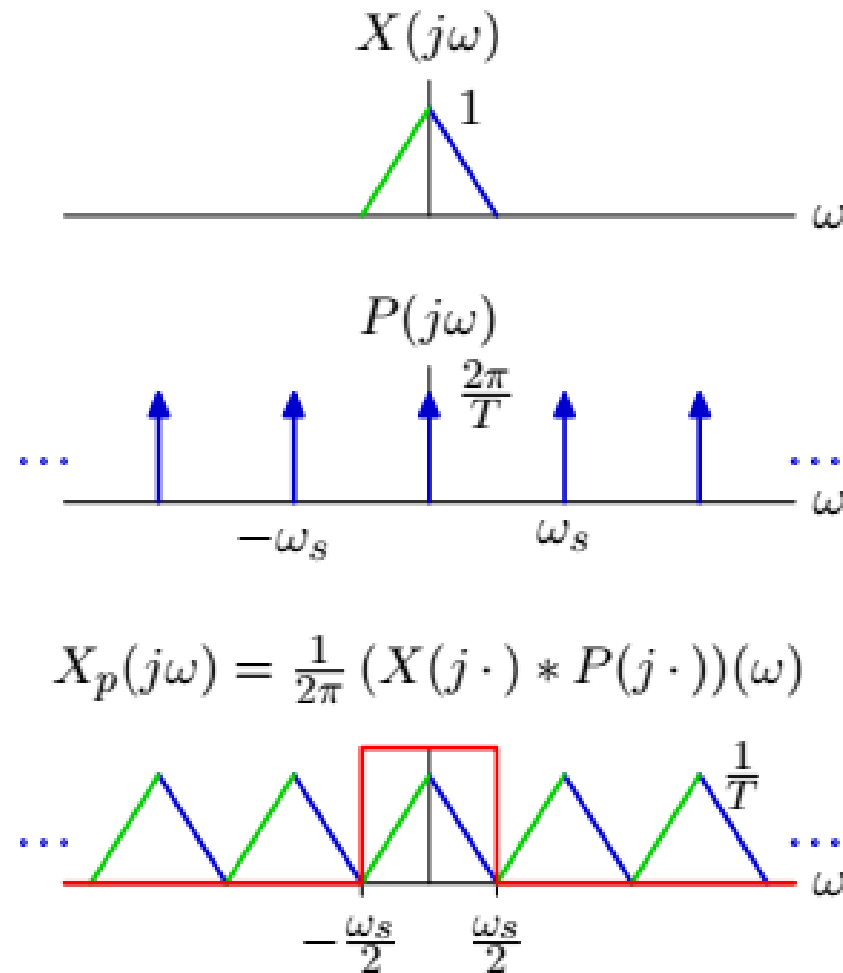
High frequency components of complex signals also wrap.



## Aliasing

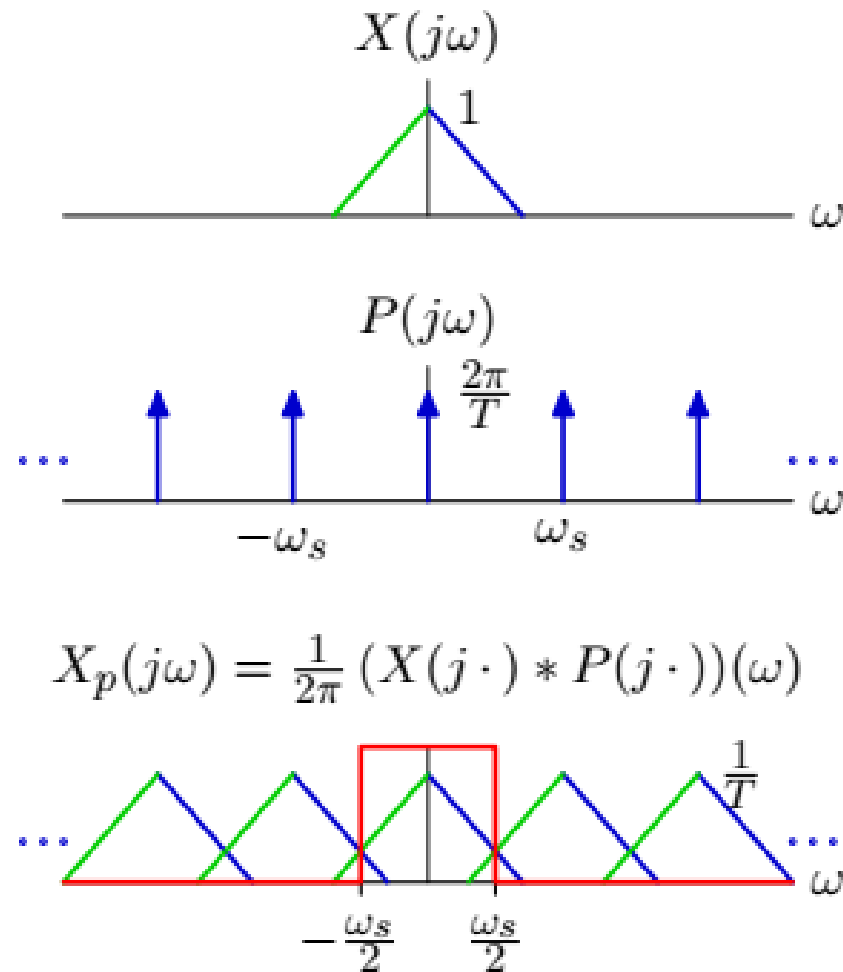
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High frequency components of complex signals also wrap.



## Aliasing

High frequency components of complex signals also wrap.

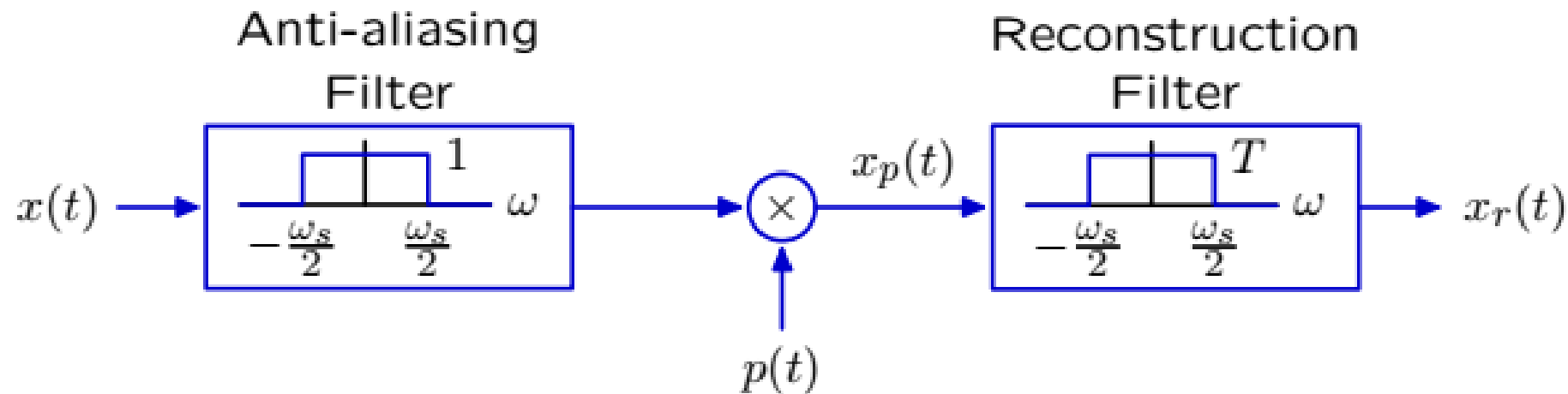




## Anti-Aliasing Filter

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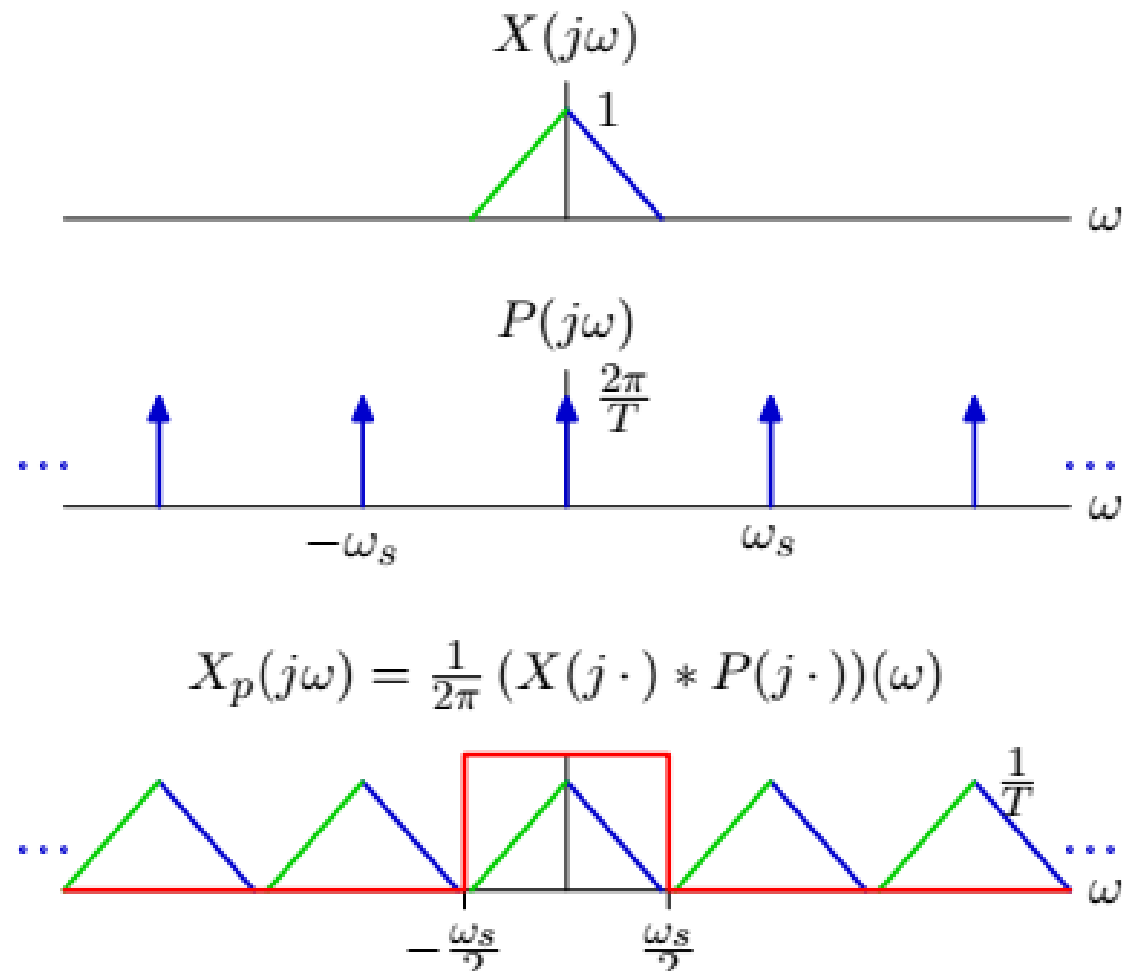
To avoid aliasing, remove frequency components that alias before sampling.



## Aliasing

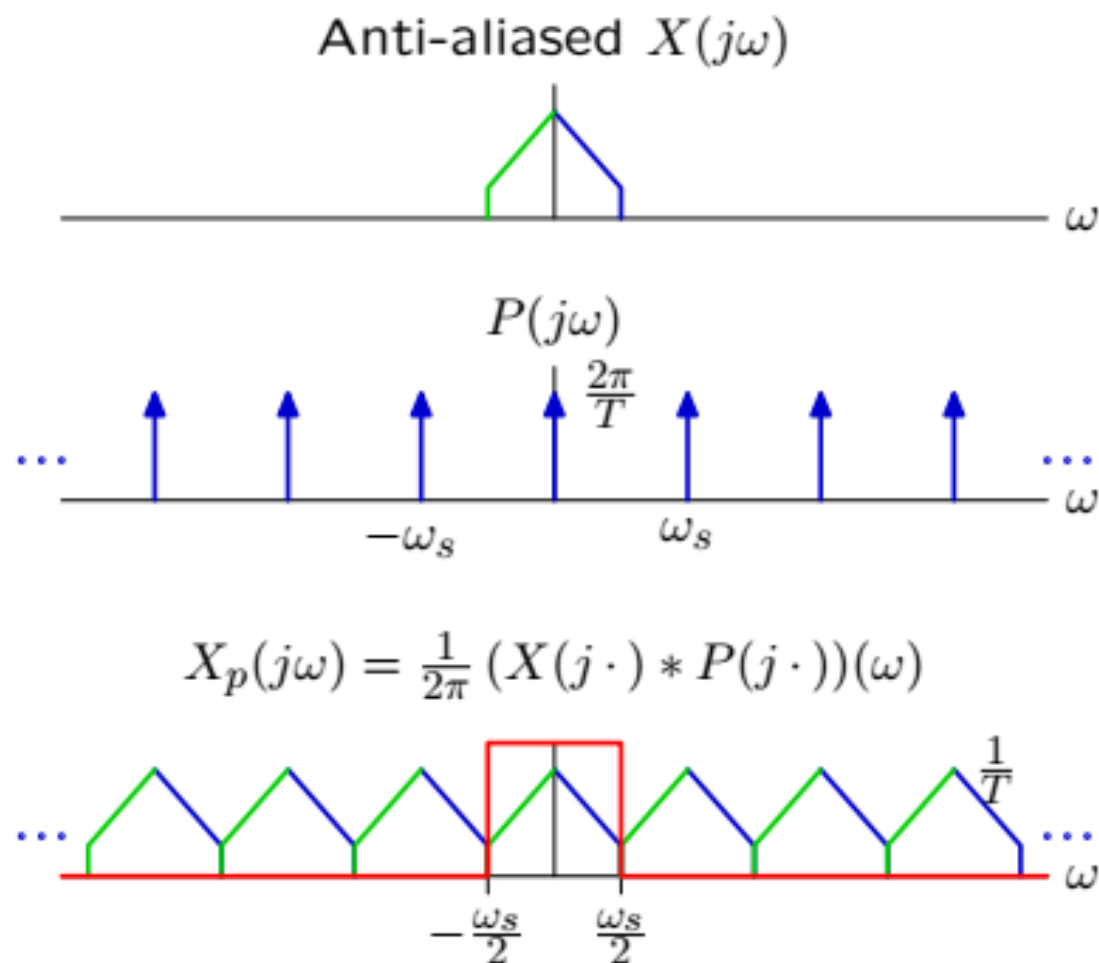
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Aliasing increases as the sampling rate decreases.



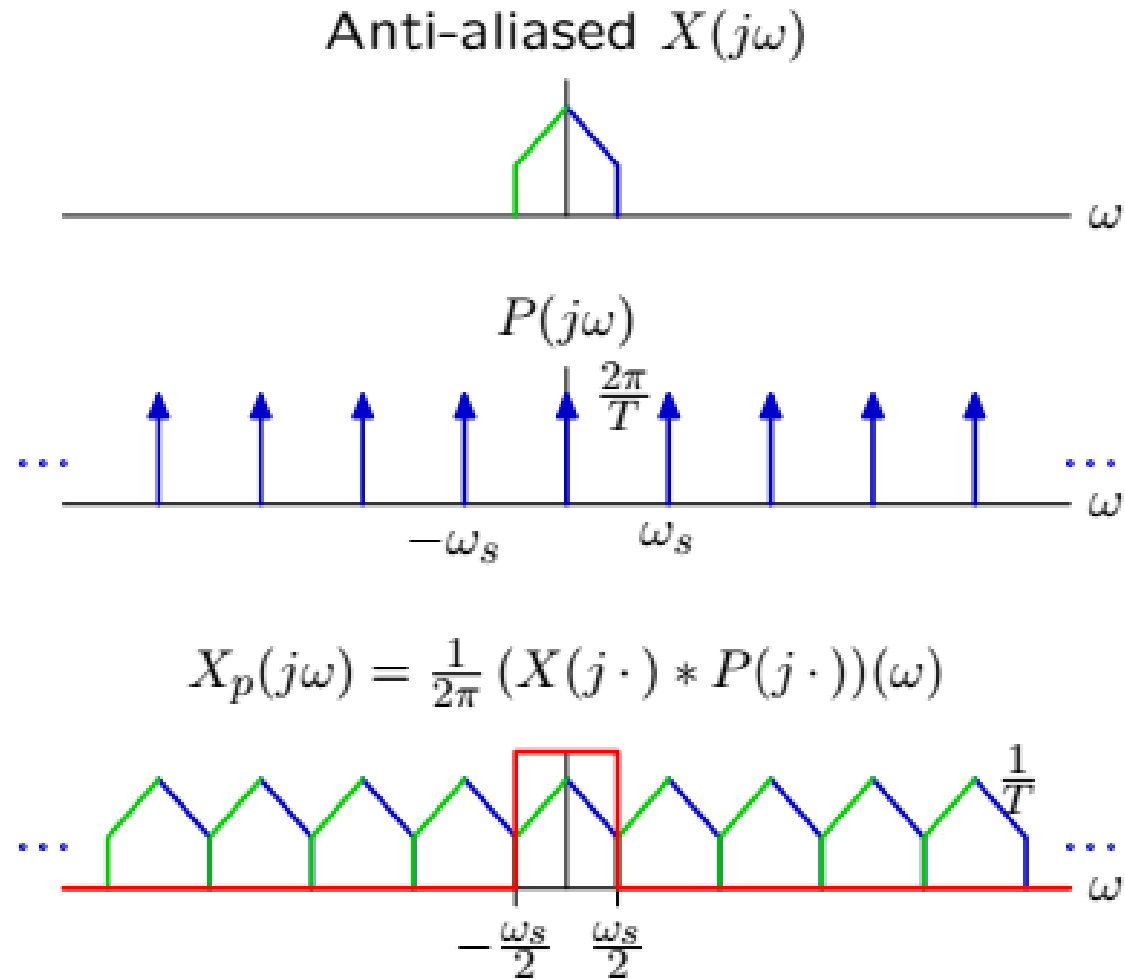
## Aliasing

Aliasing increases as the sampling rate decreases.



## Aliasing

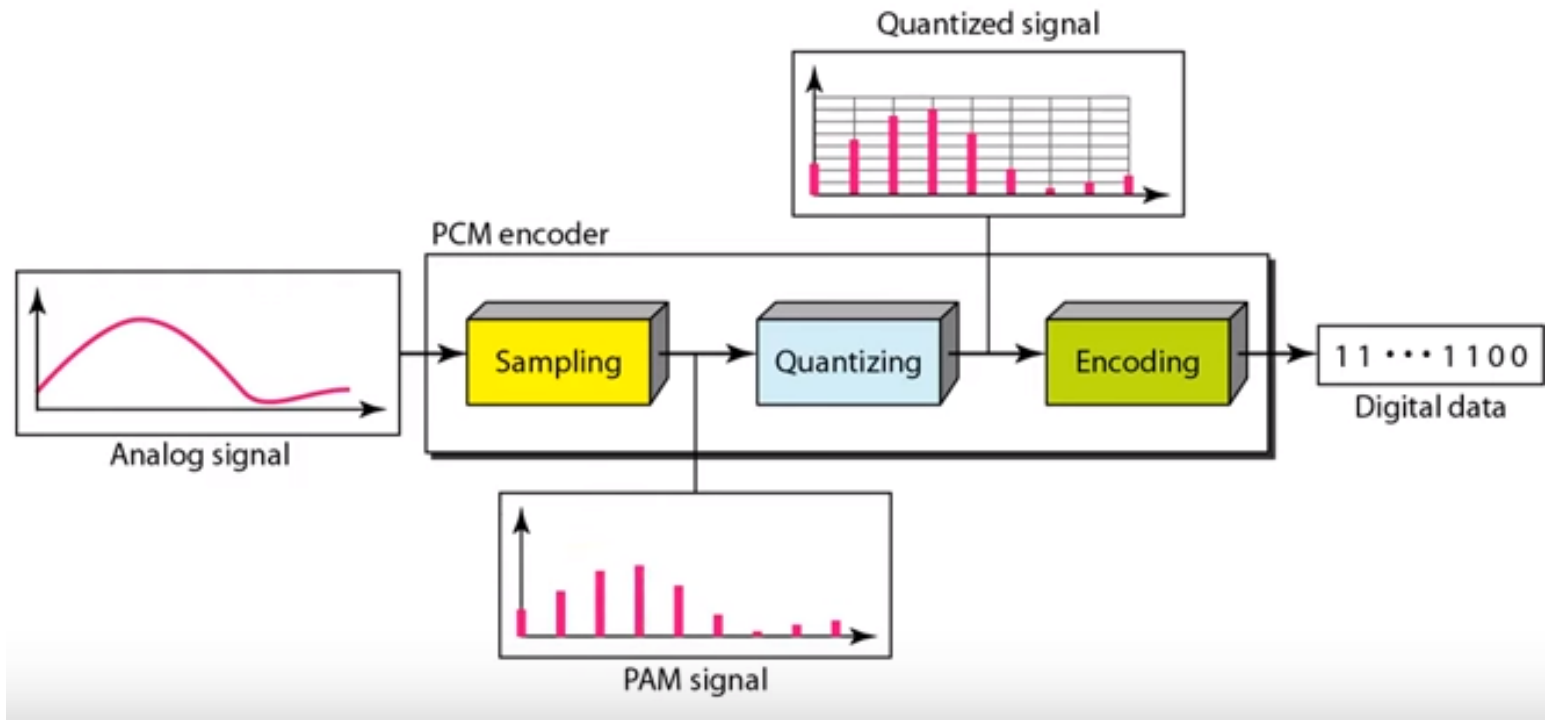
Aliasing increases as the sampling rate decreases.



# Aliasing

- <https://www.youtube.com/watch?v=yWqrx08UeUs> -- (6.30dk)
- <https://www.youtube.com/watch?v=v7qjeUFxVwQ> – (1dk)

# Quantization



- <https://www.youtube.com/watch?v=YJmUkNTBa8s>

# Bu ders notu için faydalanılan kaynaklar

## **EEEN343 Sinyaller ve Sistemler** **Ders Notları**

MIT OpenCourseWare  
<http://ocw.mit.edu>

6.003 Signals and Systems  
Fall 2011

**Prof. Dr. Serdar İplikçi**  
Pamukkale Üniversitesi  
Mühendislik Fakültesi  
Elektrik-Elektronik Mühendisliği

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