

CM19 231109Th on CTFT; convolution and modulation properties

Announcements

1. Messages from Instructor

- Goal of Life: Self-Fulfillment and Contribution to Collective (자아실현, 공동체 기여)
 - Attitude: Exceed the expectations! (기대를 넘어서라!)
- "아는 것이 힘이다. 배우고야 무슨 일이든 한다." -심훈, 상록수-
- 학습 (배우고 익히기)
 - Theory Learning (이론 배우기)
 - Problem Solving (문제 풀기)
 - 배우기와 익히기의 균형
- How to Learn
 - Stop and Think; 복기가 chess master 를 만든다; Find commonality, similarity, and difference
- How to Practice
 - Purposeful practice with 3F: Time, Focused Action (무엇을 향상시키려는 훈련인가?), Experience, Lesson, Immediate Feedback (코치의 중요성), Fix, Growth
- How to solve? How to understand? ((S))implify and ((V))isualize:
 - essence, simplify; generalize; consider extremes; mental representation, representational examples;
 - Venn diagram, necessity and sufficiency, existence and uniqueness/plurality
 - An imperfect classification rule is better than no classification rule as long as you recognize the imperfection and update your rule.
 - block diagram, $G(V,E)$; graph of a function, algebraic vs. geometric interpretations, mathematical vs. physical/engineering interpretations/implications

2. 지난 강의 수정/보완 사항

- A Gaussian pulse can be used to approximate the Dirac delta function. Actually, any time-localized function with unit area can be used.
- Notation $\langle - \rangle$

CTFS CTFT

$\uparrow \delta_\Delta(t)$

$\Delta \rightarrow 0$

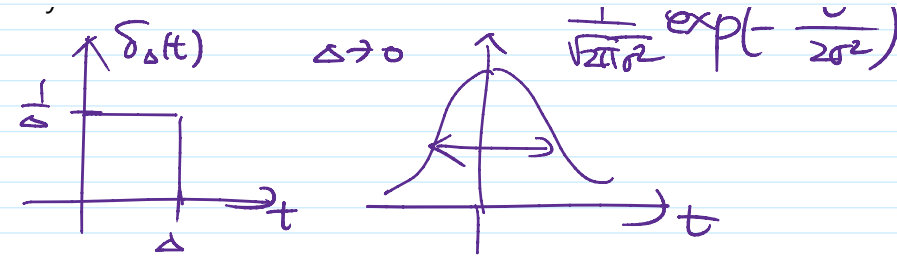
$\uparrow$

$$\frac{1}{\sqrt{2\pi}\sigma} \exp\left(-\frac{t^2}{2\sigma^2}\right)$$

function with unit area can be used.

- Notation $\leftrightarrow$
- gaussian $\leftrightarrow$ gaussian
- Impulse train $\leftrightarrow$ impulse train

$$\begin{array}{cc} \text{CTFS} & \text{CTFT} \\ \text{DTFS} & \text{DTFT} \end{array}$$
$$X(j\omega) \xleftrightarrow{FT} x(t)$$



3. HW, Quiz, and Exam

- HW10 will be assigned by this Friday. Due will be next Tuesday.
- Quiz 2 is coming. Maybe on Tue. 11/20.

4. 강의 자료

- Handouts and annotated pdfs are downloadable from the non-PLMS class homepage at <http://cisl.postech.ac.kr/class/eece233/schedule.htm>.
- Recorded CMs are available from cisl.postech YouTube channel. Please place **clickable time stamps**.

5. 출석

- 출결상태에 대해 전자출결시스템(<https://wpsc.postech.ac.kr/eams/login>)을 확인하세요. 정정사유가 있는 학생은 증빙을 제출해 주세요.

6. Overview (The numbers are the chapter numbers of the textbook)

1. Signals and Systems
2. Linear Time-Invariant Systems
3. Fourier Series Representation of Periodic Signals
4. **Continuous-time Fourier Transform**
5. **Discrete-time Fourier Transform**
6. **Time and Frequency Characterization of Signals and Systems**
9. Laplace Transform
10. Z-transform
7. Sampling
8. Communication Systems

7. Related Courses offered in 24-1

- EECE302 전자수학 A (확률 및 랜덤프로세스); 월수 2시; ~~신호및시스템~~
- EECE261/DIS1261 전자판유역; 화목 11시; 전자기학 개론

7. Related Courses Offered in 24-1

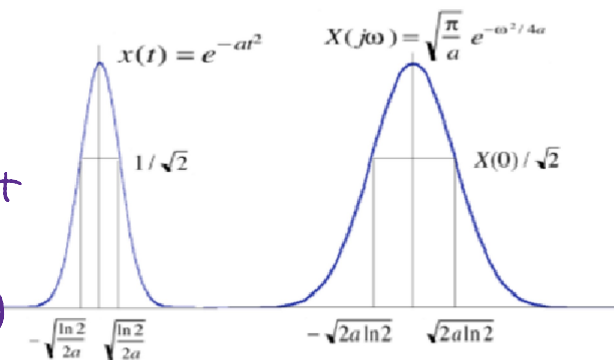
- EECE302 전자수학 A (확률 및 랜덤프로세스); 월수 2시; ~~신호및시스템~~
- EECE361/DISU361 전자파응용; 화목 11시; 전자기학 개론
- EECE441 디지털통신개론; 월수 11시; 신호및 시스템, 전자수학
- EECE442/NGCN301 통신및네트워크개론; 화목 2시
- EECE443/NGCN302 통신및네트워크실험; 월5시-10시
- EECE451 디지털신호처리개론; 화목 3시반, 신호및시스템

$$\begin{cases} x(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} X(j\omega) e^{j\omega t} d\omega \\ X(j\omega) = \int_{-\infty}^{\infty} x(t) e^{-j\omega t} dt \end{cases}$$

8. Review

- 수학적 operations로서
 - Continuous-Time Fourier Transform(ation) = CTFT
 - continuous-parameter to continuous parameter Fourier Transformation에서 time과 frequency로.
 - Def.
 - Existence and $L^1(\mathbb{R})$ functions, i.e., absolutely integrable functions on $\mathbb{R}$.
 - Fourier-Plancherel TF and $L^2(\mathbb{R})$ functions, i.e., square integrable functions on $\mathbb{R}$.
 - inverse CTFT
 - continuous-parameter to continuous parameter Fourier Transformation에서 frequency와 time으로.
- 신호 및 시스템에서
 - Synthesis equation
 - Analysis equation
 - Time $\leftrightarrow$ Frequency; The problem is that L^1 in TD is not necessarily L^1 in FD.
- Examples
 - Dirac delta $\leftrightarrow$ constant
 - delayed Dirac delta $\leftrightarrow$ linear phase shift
 - right-sided exponential function $\leftrightarrow$ a 1st-order rational function of $j\omega$
 - rectangular pulse $\leftrightarrow$ sinc pulse
 - Gaussian pulse $\leftrightarrow$ Gaussian pulse
 - Dirac delta in the FD $\leftrightarrow$ complex sinusoidal in TD
 - periodic signal $\leftrightarrow$ equally spaced Dirac deltas
 - CTFS of periodic signal
 - CTFT of periodic signal
 - impulse train $\leftrightarrow$ impulse train
 - CTFT and CTFS = CTFT of periodic signal

$$x(t) = \text{rect}\left(\frac{t}{T_1}\right) \longleftrightarrow X(j\omega) = \int_{-T_1}^{T_1} e^{-j\omega t} dt = \frac{2 \sin \omega T_1}{\omega}$$



$$\begin{aligned} \delta(\omega - \omega_0) &\xrightarrow{\mathcal{F}} \frac{1}{2\pi} e^{j\omega_0 t} \\ e^{j\omega_0 t} &\xrightarrow{\mathcal{F}} 2\pi \delta(\omega - \omega_0) \\ x(t) &= \sum_k a_k e^{jk\omega_0 t} \\ &\downarrow \\ x(t) &= \sum_k a_k \delta(t - nT) \end{aligned}$$

$$x(t) = \sum_{n=-\infty}^{\infty} \delta(t - nT) \longleftrightarrow X(j\omega) = \sum_{n=-\infty}^{\infty} \frac{2\pi}{T} \delta(\omega - \frac{k2\pi}{T})$$

- impulse train $\leftrightarrow$ impulse train
- CTFT and CTFS = CTFT of periodic signal

○ Properties of CTFT

- linearity in TD $\leftrightarrow$ linearity in FD
- shift in TD $\leftrightarrow$ linear-phase shift in FD
- real in TD $\leftrightarrow$ conjugate-symmetrical in FD
 - real-even mag; real-odd phase; real-even real-part; pure-imaginary odd j times imaginary part

$$x(t) = \sum_k a_k \delta(t - kT)$$

$$\downarrow$$

$$X(j\omega) = \sum_k a_k 2\pi \delta(\omega - \omega_0 k)$$

$$x(t) = \sum_{n=-\infty}^{+\infty} \delta(t - nT) \longleftrightarrow X(j\omega) = \sum_{k=-\infty}^{+\infty} \frac{2\pi}{T} \delta\left(\omega - \underbrace{\frac{k2\pi}{T}}_{k\omega_0}\right)$$

Properties of the CT Fourier Transform

1) Linearity $ax(t) + by(t) \longleftrightarrow aX(j\omega) + bY(j\omega)$

2) Time Shifting $x(t - t_0) \longleftrightarrow e^{-j\omega t_0} X(j\omega)$

Proof: $\int_{-\infty}^{\infty} x(t - t_0) e^{-j\omega t} dt = e^{-j\omega t_0} \int_{-\infty}^{\infty} x(t') e^{-j\omega t'} dt' = e^{-j\omega t_0} X(j\omega)$

FT magnitude unchanged

$$|e^{-j\omega t_0} X(j\omega)| = |X(j\omega)|$$

Linear change in FT phase

$x(t)$ 를 time shifting을 하며 $X(j\omega)$ 에 linear phase shift가 추가된다.

$$\angle(e^{-j\omega t_0} X(j\omega)) = \angle X(j\omega) - \omega t_0$$

Given $x(t) \leftrightarrow X(j\omega)$,
And $Y(j\omega)$ when $y(t) = x(t - t_0)$

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CTFT Properties (continued)

3) Conjugate Symmetry

$$x(t) \text{ real} \longleftrightarrow X(-j\omega) = X^*(j\omega)$$

$\Downarrow$

$$|X(-j\omega)| = |X(j\omega)|$$

Even

$$|X(-j\omega)| = |X(j\omega)| \quad \text{Even}$$

$$\angle X(-j\omega) = -\angle X(j\omega) \quad \text{Odd}$$

$$\text{Or} \quad \text{Re}\{X(-j\omega)\} = \text{Re}\{X(j\omega)\} \quad \text{Even}$$

$$\text{Im}\{X(-j\omega)\} = -\text{Im}\{X(j\omega)\} \quad \text{Odd}$$

When $x(t)$ is **real** (all the physically measurable signals are **real**), the **negative frequency components do not** carry any additional information from the positive frequency components. $\omega \geq 0$ will be sufficient.

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- time compression vs. dilation
- Given a Fourier Transform pair x and X , find the CTFTs of ...

Q. audio signal
을 빠르게 play
하면 고음화 되
는데 어떻게 하
면 높이는 일정
하게 하면서 빠
르게 play할 수
있을까?

-> MATLAB
project에서 구
현?!

The Properties Keep on Coming ...

4) Time-Scaling

$$x(at) \longleftrightarrow \frac{1}{|a|} X\left(j\frac{\omega}{a}\right)$$

E.g. $a > 1 \rightarrow at > t$
compressed in time $\leftrightarrow$
stretched in frequency

$$\Downarrow a = -1$$

5) Time-Reverse

$$x(-t) \longleftrightarrow X(-j\omega)$$

$$\Downarrow$$

a) $x(t)$ **real** and even

$$x(t) = x(-t) = x^*(t)$$

$$\Rightarrow X(j\omega) = X(-j\omega) = X^*(j\omega) \text{ — Real \& even}$$

일반적으로 $X(j\omega)$ 는
complex
valued function
of ω 이다.

b) $x(t)$ **real** and odd

$$x(t) = -x(-t) = x^*(t)$$

$$\Rightarrow X(j\omega) = -X(-j\omega) = -X^*(j\omega) \text{ — Purely imaginary \& odd}$$

c) $X(j\omega) = \text{Re}\{X(j\omega)\} + j\text{Im}\{X(j\omega)\}$

이 관계 c)는

For **real**

$$x(t) = \text{Ev}\{x(t)\} + \text{Od}\{x(t)\}$$

communication system에서 real
bandpass signal을 이해하는데 있어
매우 중요하다.

~~(MR)~~
(MR)

$$x(t) = c e^{j\omega_0 t}$$

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For real $x(t) = \text{Ev}\{x(t)\} + \text{Od}\{x(t)\}$ bandpass signal을 이해하는데 있어 매우 중요하다.

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반드시 기억할 것

$$\begin{aligned} x(t) &\leftrightarrow X(j\omega) \\ x(-t) &\leftrightarrow X(-j\omega) \\ x(t)^* &\leftrightarrow X(-j\omega)^* \\ x(-t)^* &\leftrightarrow X(j\omega)^* \end{aligned}$$

9. Preview

○ Properties of CTFT

■ Convolution Property; TD convolution $\leftrightarrow$ FD multiplication

□ Frequency response revisited

□ Examples

◆ phasor analysis for an LTI system with real-valued impulse response and a real-valued sinusoidal input signal.

◇ a differentiator in initial rest

◇ an integrator in initial rest

◇ the notion of impedance

◆ an ideal LPF

◇ impulse response and causality

◇ step response and sine integral, Gibbs' phenomenon

◆ cascading filters

◇ integration of product of sinc pulses

◇ convolution of gaussian pulses

◆ convolution of two right-sided exponential functions

◆ A system whose I/O relation is described by an LCCDE with initial rest condition satisfied

◇ linear constant-coefficient differential equation (LCCDE)

■ Parseval's relation

□ Energy Spectral Density (ESD)

■ Multiplication Property; TD multiplication $\leftrightarrow$ FD convolution

□ Duality 쌍대성

□ Example

- ◆ amplitude modulation (AM) in communications

EECE233 Signals and Systems

앞서 Lecture Note #8에서 CT signal에 대해 FT과 inverse FT을 배웠다. 여기서는 이들의 properties에 대해 배운다.

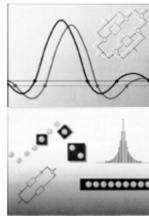
Lecture Note #9

Prof. Joon Ho Cho

(Slides thanks to Qing Hu*, D. Boning, D. Freeman, T. Weiss, J. White, and A. Willsky)

- Covers O & W pp. 306-333, 358-361
- The convolution Property of the CTFT
- Frequency Response and LTI Systems Revisited
- Multiplication Property and Parseval's Relation
- The DT Fourier Transform

* These lecture notes are based on the lecture notes used in 6.003 taught by Prof. Qing Hu at M.I.T. These notes are adopted for EECE233 under the permission of Prof. Qing Hu.



The CT Fourier Transform Pair

$$x(t) \longleftrightarrow X(j\omega)$$

$$X(j\omega) = \int_{-\infty}^{+\infty} x(t) e^{-j\omega t} dt \quad \text{--- } x(t) \text{의 FT}$$

$$x(t) = \frac{1}{2\pi} \int_{-\infty}^{+\infty} X(j\omega) e^{j\omega t} d\omega \quad \text{--- } X(j\omega) \text{의 Inverse FT}$$

Last lecture: some properties

Today: further exploration

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Math: Convolution의 FT은 FT들의 Product이다.

EE: LTI system output의 CTFT는 input CTFT와 frequency response의 곱이다.

Convolution Property

$$y(t) = h(t) * x(t) \longleftrightarrow Y(j\omega) = H(j\omega)X(j\omega)$$

where $h(t) \longleftrightarrow H(j\omega)$

Basically a consequence of the eigenfunction property

$$\begin{aligned}
 & a e^{j\omega t} \longrightarrow \boxed{h(t)} \longrightarrow H(j\omega) a e^{j\omega t} \\
 & \Downarrow \text{superposition} \\
 & x(t) = \int_{-\infty}^{+\infty} \underbrace{\left(\frac{1}{2\pi} X(j\omega) d\omega \right)}_{\text{coefficient}} e^{j\omega t} \\
 & y(t) = \int_{-\infty}^{+\infty} \underbrace{\left(H(j\omega) \cdot \frac{1}{2\pi} X(j\omega) d\omega \right)}_{\text{New coefficient}} e^{j\omega t}
 \end{aligned}$$

Handwritten notes: $\sum_k$ and $e^{j\omega_k t}$ are written next to the first equation. Below the second equation, there is a handwritten note: $1 \int_{-\infty}^{+\infty} H(j\omega) X(j\omega) d\omega$.

이 성질은, two independent random variables의 합의 pdf는 두 pdf의 convolution이고, 따라서 two independent random variables의 합의 characteristic function은 두 characteristic functions의 곱이라는 성질을 연상시킨다.

이때는 성질들만
상세한다.

$$y(t) = \sum_k \left(\int_{-\infty}^{\infty} H(j\omega) X(j\omega) e^{j\omega t} d\omega \right) e^{j\omega_k t}$$

New coefficient

$$= \frac{1}{2\pi} \int_{-\infty}^{\infty} \underbrace{H(j\omega) X(j\omega)}_{= Y(j\omega)} e^{j\omega t} d\omega$$

Now, we have a crude tool to **design** the impulse resp. of a **filter**.

1. Design the frequency response of the desired filter.
2. Find the inverse CTFT. Done!

The Frequency Response Revisited

$$x(t) \longrightarrow \boxed{h(t)} \longrightarrow y(t) = h(t) * x(t)$$

$$Y(j\omega) = H(j\omega)X(j\omega)$$

$\Downarrow$

The frequency response $H(j\omega)$ of a CT LTI system is simply the Fourier transform of its impulse response $h(t)$

Example #1:

$$x(t) = e^{j\omega_0 t} \longrightarrow \boxed{H(j\omega)} \longrightarrow y(t)$$

Recall

$$e^{j\omega_0 t} \longleftrightarrow 2\pi\delta(\omega - \omega_0)$$

$$Y(j\omega) = H(j\omega)X(j\omega) = H(j\omega)2\pi\delta(\omega - \omega_0) = 2\pi H(j\omega_0)\delta(\omega - \omega_0)$$

$\Downarrow$ inverse FT

$$y(t) = H(j\omega_0)e^{j\omega_0 t}$$

Now it is clear to see frequency shaping effects of earlier demos.

이 결과로부터 phasor analysis 가 나온다. linear circuit의 입력이 sinusoid일때 출력을 계산하기 위해서 굳이 differential equation을 풀 필요가 없이 algebraic equation을 풀면 해결이 된다.

Example #2: A differentiator

$$x(t) \longrightarrow \boxed{\frac{d}{dt}} \longrightarrow y(t)$$

$$y(t) = \frac{dx(t)}{dt}$$

— an LTI system

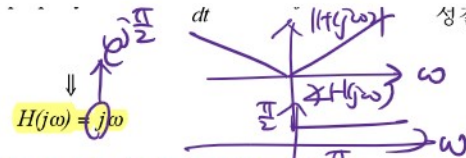
From differentiation property $\Rightarrow$

$$\frac{d}{dt} \xleftrightarrow{FT} j\omega$$

$\Rightarrow$ $H(j\omega) = j\omega$

phasor analysis에서
미분은 $j\omega$ 로
적분은 $1/(j\omega)$ 로
바꾼 것은 바로
Fourier transform의
성질때문이었다.

$$x(t) \longrightarrow \boxed{u_1(t)} \xrightarrow{u_1(t)} \equiv x(j\omega) \longrightarrow \boxed{j\omega} \longrightarrow y(j\omega)$$



1) Amplifies high frequencies (enhances sharp edges)

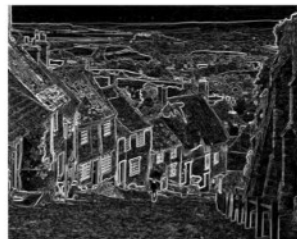
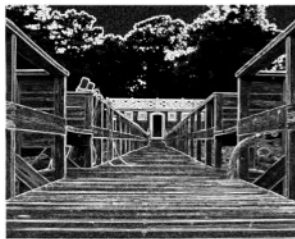
2) $+\pi/2$ phase shift ($j = e^{j\pi/2}$) Larger at high ω phase shift

$$\frac{d}{dt} \sin \omega_o t = \omega_o \cos \omega_o t = \omega_o \sin(\omega_o t + \pi/2)$$

$$\frac{d}{dt} \cos \omega_o t = -\omega_o \sin \omega_o t = \omega_o \cos(\omega_o t + \pi/2)$$

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Example #2: Edge enhancement using DT differentiator



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cf) integrator under initial rest

$$\equiv \frac{x(t)}{u_1(t)} \frac{y(t)}{y(t)} =$$

$$\frac{X(j\omega)}{j\omega + \pi\delta(\omega)} \frac{Y(j\omega)}{Y(j\omega)}$$



$$= \frac{(u(t) - \frac{1}{2}) + \frac{1}{2}}{j\omega + \pi\delta(\omega)}$$

$$\int_{-\Delta}^{\Delta} () \cdot e^{j\omega t} dt$$

$$\lim_{\Delta \rightarrow \infty}$$

Example #3: Impulse Response of an **Ideal Lowpass Filter**

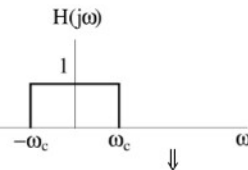
Example #3: Impulse Response of an **Ideal Lowpass** Filter

Q1. Is the square pulse an L^1 function?

A1. Yes.

Q2. Is the CTFT of the square pulse an L^1 function?

A2. No.



Q3. Is the CTFT of the square pulse an L^2 function?

A3. Yes.

따라서 iFT은 존재하지 않지만
iFPT가 존재하고 MS sense로 $x(t)$
가 된다.

$$h(t) = \frac{1}{2\pi} \int_{-\omega_c}^{\omega_c} e^{j\omega t} d\omega = \frac{\sin \omega_c t}{\pi t} = \frac{\omega_c}{\pi} \text{sinc}\left(\frac{\omega_c t}{\pi}\right)$$

$$\sin c(\theta) = \frac{\sin(\pi\theta)}{\pi\theta}$$

Questions:

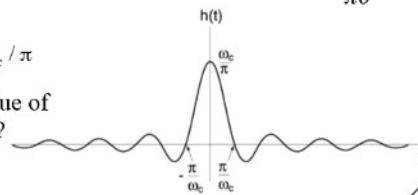
1) Is this a causal system? **No.**

2) What is $h(0)$?

$$h(0) = \frac{1}{2\pi} \int_{-\infty}^{\infty} H(j\omega) d\omega = \omega_c / \pi$$

3) What is the steady-state value of the step response, i. e. $s(\infty)$?

$$s(\infty) = \int_{-\infty}^{\infty} h(t) dt = H(j0) = 1$$



Def. The **sine integral** is defined as

$$\text{Si}(x) = \int_0^x \frac{\sin(t)}{t} dt$$

이것을 이용하여 CTFT에서의 Gibbs' phenomenon을 증명할 수 있다.

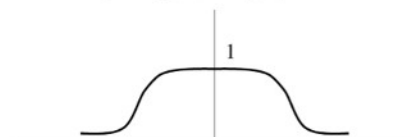
Example #4: **Cascading** filtering operations



$$H(j\omega) = H_1(j\omega) H_2(j\omega)$$

convolution이 CTFT들의 곱으로 나타났으므로 당연한 결과이다

e.g. $H_1(j\omega) = H_2(j\omega)$



$H(j\omega) = H_1^2(j\omega)$ has a sharper frequency selectivity

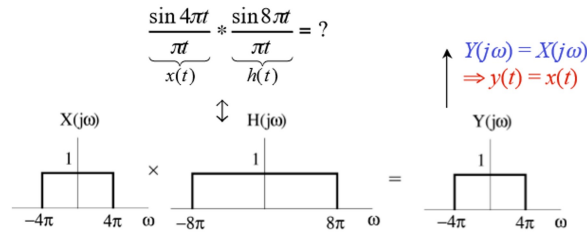
TD / Impulse response $h(t) \leftrightarrow H(j\omega)$
Step $s(t) = \int_{-\infty}^t h(\tau) d\tau$
" $= \text{Si}(x)$

더 narrow한 non-ideal LPT이면 resultant filter는 더 narrow한 LPT이다.

중요: 시스템이 LTI이면 input에 없던 frequency 성분이 output에서 생겨나지 않는다.

Example #5:

Q. $\int_{-\infty}^{\infty} \text{sinc}(x) \text{sinc}(3x) dx = ?$
 pi. $\int_0^{\infty} \frac{1}{x^2} dx = ?$
 Then, $\int_0^{\infty} \frac{1}{x^3} dx = ?$
 dx?
 A. $< \pi$. Why?



Example #6:

$$e^{-at^2} * e^{-bt^2} = ?$$

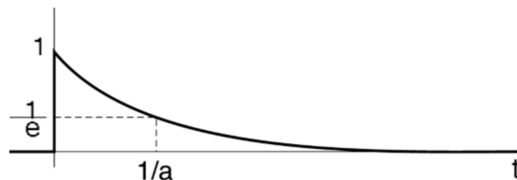
$$\sqrt{\frac{\pi}{a}} e^{-\frac{\omega^2}{4a}} \times \sqrt{\frac{\pi}{b}} e^{-\frac{\omega^2}{4b}} = \sqrt{\frac{\pi}{ab}} e^{-\frac{\omega^2}{4} \left(\frac{1}{a} + \frac{1}{b} \right)}$$

Gaussian $\times$ Gaussian = Gaussian, Gaussian $*$ Gaussian = Gaussian

전자수학A에서, "두 independent Gaussian random variables의 합은 Gaussian random variable임을 보여라."는 문제를 풀때 characteristic function을 이용해서 푼다.

이 과목에서 가장 중요한 교훈(lesson):
 time domain에서 잘 안되면 frequency domain에서 생각하라!!!! vice versa

Review from the last lecture, right-sided exponential



$$x(t) = e^{-at}u(t), \quad a > 0$$

$$X(j\omega) = \int_{-\infty}^{\infty} x(t) e^{-j\omega t} dt = \int_0^{\infty} e^{-at} e^{-j\omega t} dt$$

여기서 반드시 기억할 것은, right-sided real

$$\int_{-\infty}^{\infty} \frac{\sin \pi x}{\pi x} \frac{\sin 3\pi x}{3\pi x} dx = 1$$

$$\int_{-\infty}^{\infty} 1 dx = \infty$$

$$\int_{-\infty}^{\infty} dx = \infty$$

$$\int_{-\infty}^{\infty} \frac{1}{x^2} dx < \infty$$

부분분수분해 if $a \neq b$

$$\frac{1}{x+a} \frac{1}{x+b} = \frac{1}{b-a} \left(\frac{1}{x+a} - \frac{1}{x+b} \right)$$

$$X(j\omega) = \int_{-\infty}^{+\infty} x(t)e^{-j\omega t} dt = \int_0^{+\infty} \underbrace{e^{-at} e^{-j\omega t}}_{e^{-(a+j\omega)t}} dt$$

$$= -\left(\frac{1}{a+j\omega}\right) e^{-(a+j\omega)t} \Big|_0^{\infty} = \frac{1}{a+j\omega}$$

여기서 반드시 기억
할 것은,
right-sided real
exponential의
CTFT는
rational function of
j omega 라는 것이
다.

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$\frac{1}{s+a}$
 $s = -a$

Example #7:

$$h(t) = e^{-t}u(t), \quad x(t) = e^{-2t}u(t)$$

$$y(t) = h(t) * x(t) = ?$$

$\Downarrow$

$$Y(j\omega) = H(j\omega)X(j\omega) = \frac{1}{1+j\omega} \cdot \frac{1}{2+j\omega}$$

Q. 자 이제 inverse FT 을 해야
하는데 어떻게 하나?

A. 부분분수 분해를 하여 다시
right-sided exponential
function들의 FT이 $1/(a+j\omega)$
(\omega)임을 이용한다.

— a rational function of $j\omega$, ratio of polynomials of $j\omega$

$\Downarrow$ Partial fraction expansion

$$Y(j\omega) = \frac{1}{1+j\omega} - \frac{1}{2+j\omega}$$

$\Downarrow$ inverse FT

$$y(t) = [e^{-t} - e^{-2t}]u(t)$$

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Q. 고등학교 시험문제에 이
문제가 나왔다면?

A. time-domain에서
convolution하는 것은 고등
학교 적분실력으로 할 수 있
을 것이다. 시도해 보자.

그러나 이제는, ???
frequency-domain에서 할
수 있다!!!! 있어야 한다!!!

RLC circuit에서
입출력관계는 언
제나 LCCDE로
나타낼 수 있다.

Example #8: LTI Systems Described by LCCDE's (Linear-constant-coefficient differential equations)

$$\sum_{k=0}^N a_k \frac{d^k y(t)}{dt^k} = \sum_{k=0}^M b_k \frac{d^k x(t)}{dt^k}$$

LCCDE라고 하여 언제나 LTI시스템을
나타내는 것은 아니며, initial condition
에 따라 LTI system 이 아닐 수 있다.

Q. 적분기는 어디
있는가?

Using the Differentiation Property

frequency response

Q. When

$$x(t) \rightarrow \boxed{y'(t) + ay(t) = x(t)} \rightarrow y(t)$$

$$y'(t) + ay(t) = x(t), \text{ find } h(t).$$

$\Downarrow$

$$(j\omega + a) Y(j\omega) = X(j\omega)$$

$$H(j\omega) = \frac{Y(j\omega)}{X(j\omega)} = \frac{1}{j\omega + a}$$

=> phasor analysis가능...

- 1) **Rational**, can use exp. to get $h(t)$
- 2) If $X(j\omega)$ is rational i.e. $x(t) = \sum \alpha_i e^{-\beta_i t} u(t)$, then $Y(j\omega)$ is also rational.

$$y(t) = \begin{cases} e^{-at} u(t) & \text{causal} \\ -e^{at} u(-t) & \text{anti-causal} \end{cases}$$

$$Y(j\omega) = H(j\omega) X(j\omega)$$

$$H(j\omega) = \frac{Y(j\omega)}{X(j\omega)}$$

$$\int_{-\infty}^{\infty} x(t) x^*(t) dt$$

Parseval's Relation

$$E_{xx} = \underbrace{\int_{-\infty}^{+\infty} |x(t)|^2 dt}_{\text{Total energy in the time-domain}} = \underbrace{\frac{1}{2\pi} \int_{-\infty}^{+\infty} |X(j\omega)|^2 d\omega}_{\text{Total energy in the frequency-domain}}$$

$\frac{1}{2\pi} |X(j\omega)|^2$
— energy spectral density (ESD)

이를 energy spectral density라고 한다. 이유는??

적분해서 energy가 되니까.
그게 다일까?

어떤 주파수에서 very narrow bandpass filter를 만들면 그 출력의 에너지는 이 에너지스펙트럼밀도의 그 주파수 성분 곱하기 필터의 bandwidth가 된다.

Q. 유도해 보라.

$$\begin{aligned} & \int_{-\infty}^{+\infty} x(t) x^*(t) dt \\ &= \int_{-\infty}^{+\infty} x(t) \left(\frac{1}{2\pi} \int_{-\infty}^{+\infty} X(j\omega) e^{j\omega t} d\omega \right)^* dt \\ &= \dots \\ & \frac{|X(j\omega)|^2}{2\pi} \end{aligned}$$

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Multiplication Property

Since FT is highly symmetric,

$$x(t) = \mathcal{F}^{-1}\{X(j\omega)\} = \frac{1}{2\pi} \int_{-\infty}^{+\infty} X(j\omega) e^{j\omega t} d\omega, \quad X(j\omega) = \mathcal{F}\{x(t)\} = \int_{-\infty}^{+\infty} x(t) e^{-j\omega t} dt$$

$$\text{thus if } x(t) * y(t) \longleftrightarrow X(j\omega) \cdot Y(j\omega)$$

time domain에서의 곱은
frequency domain에서의
convolution
그런데 radian frequency를 쓰
면 2π 때문에 헷갈린다.
그냥 Hz를 쓰면 간단하다.
 2π 어찌고하는 계수가 나타나
지 않는다.

$$x(t) = \mathcal{F}^{-1}\{X(j\omega)\} = \frac{1}{2\pi} \int_{-\infty}^{+\infty} X(j\omega) e^{j\omega t} d\omega$$

$$\text{then the other way } x(t) \cdot y(t) \longleftrightarrow \frac{1}{2\pi} X(j\omega) * Y(j\omega)$$

around is also true

$$= \frac{1}{2\pi} \int_{-\infty}^{+\infty} X(j\theta) Y(j(\omega - \theta)) d\theta$$

— Definition of
convolution in ω

then the other way $x(t) \cdot y(t) \longleftrightarrow \frac{1}{2\pi} X(j\omega) * Y(j\omega)$
 around is also true $= \frac{1}{2\pi} \int_{-\infty}^{+\infty} X(j\theta) Y(j(\omega - \theta)) d\theta$ — Definition of convolution in ω
 — A consequence of **Duality**

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Examples of the Multiplication Property

((S))

real baseband voice
 $r(t) = s(t) \cdot p(t) \longleftrightarrow R(j\omega) = \frac{1}{2\pi} [S(j\omega) * P(j\omega)]$

Q. $s(t)$ 가 input이고 $r(t)$ 가 output일때 이 system은 linear인가? 만약 linear라면 LTI인가?

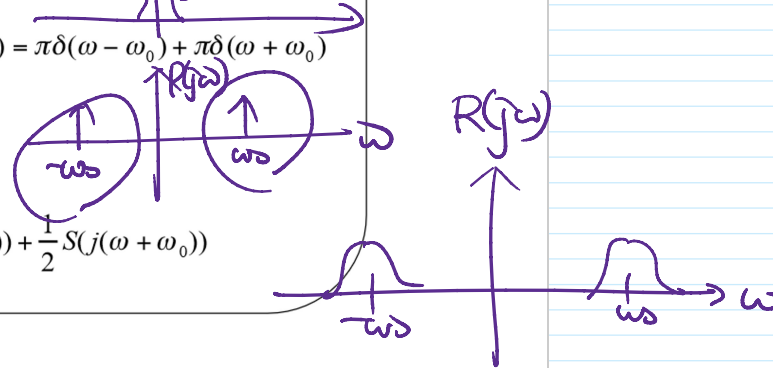
A. linear이나 nonzero ω 에 대해 LTI는 아니다. 주파수 성분을 보면, input에 없던 성분이 생겨난다. 고로 LTI가 아니다.

For $p(t) = \cos \omega_0 t \longleftrightarrow P(j\omega) = \pi \delta(\omega - \omega_0) + \pi \delta(\omega + \omega_0)$

carrier
 통신에서 up-conversion!

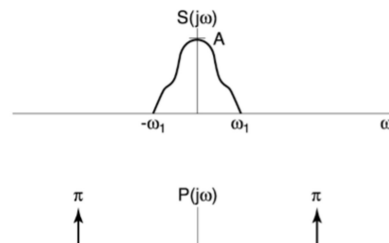
$$R(j\omega) = \frac{1}{2} S(j(\omega - \omega_0)) + \frac{1}{2} S(j(\omega + \omega_0))$$

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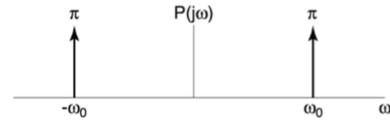
Example (continued)

$r(t) = s(t) \cdot \cos(\omega_0 t)$
 Amplitude modulation (AM)



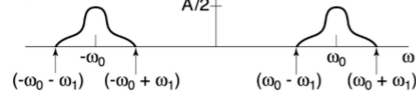
Q. 여기서 $s(t)$ 가 음성신호라고 하고 $\cos(\omega_0 t)$ 가 반송파 신호라고 하면 출력은?
 A. AM signal

Amplitude modulation (AM)



$$R(j\omega) = \frac{1}{2} [S(j(\omega - \omega_o)) + S(j(\omega + \omega_o))]$$

$$R(j\omega) = \frac{1}{2\pi} [S(j\omega) * P(j\omega)]$$



Drawn assume $\omega_o - \omega_1 > 0$
i.e. $\omega_o > \omega_1$

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Q. AM signal의 Fourier transform은?

A. $s(t)$ 의 FT를 좌우로 frequency shifting한 것.

=> radio station들의 frequency division duplexing법으로 서로 다른 주파수를 써서 주파수 영역에서 신호들이 overlap이 되지 않도록 한다.

Q. Time domain에서 생각해도 AM은 쉽게 이해할 수 있다.

즉

송신단에서는 메시지 신호 $s(t)$ 에 carrier 신호 $\cos[\omega_0 t]$ 를 곱하여 보내고

수신단에서는 수신신호

$$s(t - t_0) \cos[\omega_0 (t - t_0)]$$

에 $\cos[\omega_0 (t - t_0)]$ 를 곱하고 LFP하면 $s(t)/2$ 를 얻는다. Why?

그러나 $\cos[\omega_0 (t - t_0)]$ 를 아는 것은 불가능하다. 따라서 그냥 $\cos[\omega_0 t + \theta]$ 를 곱하면 어떤 일이 벌어질까? 이 문제를 어떻게 해결할까? -> 정보통신공학개론을 보라.