## Unit 5.1: Fourier Analysis

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The preparatory reading for this section is <u>Chapter 7</u> of [<u>Karris, 2012</u>] and <u>Chapter 5</u> of [<u>Hsu, 2020</u>].

Follow along at <a href="mailto:cpjobling.github.io/eg-150-textbook/fourier-series/1/trig-fseries">cpjobling.github.io/eg-150-textbook/fourier-series/1/trig-fseries</a>



## Introduction

Any periodic waveform with fundamental frequency  $\Omega_0=2\pi F_0$  can be approximated by a DC component (which may be 0) and the sum of sinusoidal waveforms at the fundamental and integer multiples of the fundamental frequency.

These integer multiples of the fundamental frequency  $2\Omega_0$ ,  $3\Omega_0$ ,  $4\Omega_0$ , ...,  $\Omega_N$  are called the harmonic frequencies.

The approximation of a periodic waveform by a sum of *harmonic waveforms*, is known as *Fourier analysis*.

Fourier analysis has important applications in many branches of electronics but is particularly crucial for signal processing and communications.

## Agenda

- Introduction
- Periodic Signals
- Motivating Examples
- Wave Analysis

- Odd, Even and Half-wave Symmetry
- Computing coefficients of Trig. Fourier Series in MATLAB
- Gibbs Phenomenon
- Examples 16

## Periodic Signals

In <u>Periodic signals</u> we defined a continuous-time signal x(t) to be periodic if there is a positive nonzero value of T for which

$$x(t + nT) = x(t) \qquad \text{all } t \tag{44}$$

The fundamental period  $T_0$  of x(t) is the smallest positive value of T for which Eq.  $\underline{(44)}$  is satisfied, and  $1/T_0=f_0$  is referred to as the fundamental frequency.

Two basic examples of periodic signals are the real sinusoidal signal

$$x(t) = \cos\left(\Omega_0 t + \phi\right) \tag{45}$$

and the complex exponential signal

$$x(t) = e^{j\Omega t} (46)$$

where  $\Omega_0=2\pi/T_0=2\pi f_0$  is called the fundamental angular frequency.

## **Motivating Examples**

This <u>Fourier Series demo</u>, developed by Members of the Center for Signal and Image Processing (CSIP) at the <u>School of Electrical and Computer Engineering</u> at the <u>Georgia Institute of Technology</u>, shows how periodic signals can be synthesised by a sum of sinusoidal signals.

It is here used as a motivational example in our introduction to <u>Fourier Series</u> [Wikipedia]. (See also <u>Fourier Series</u> from Wolfram MathWorld)

To install this example, download the <u>zip file</u> and unpack it somewhere on your MATLAB path.

#### Demo 1

Building up wave forms from sinusoids.

fseriesdemo

#### Demo 2

Actual measurements

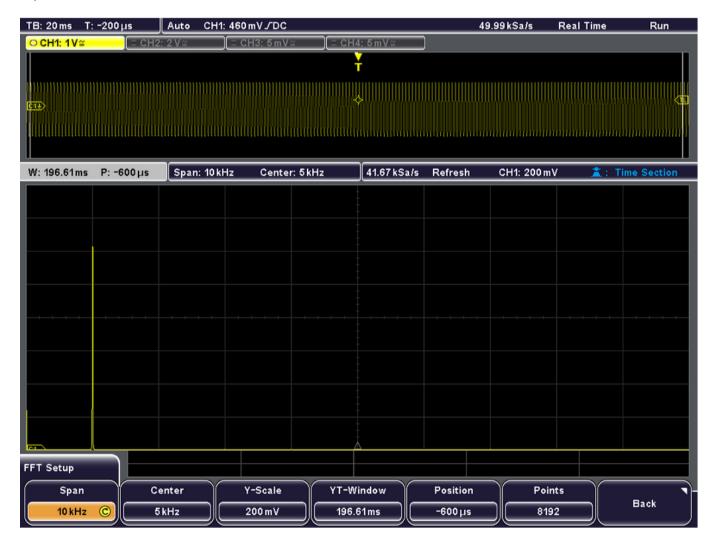
Taken by Dr Tim Davies with a Rhode&Schwarz Oscilloscope.

Note all spectra shown in these slides are generated numerically from the input signals by sampling and the application of the Fast Fourier Transform (FFT).

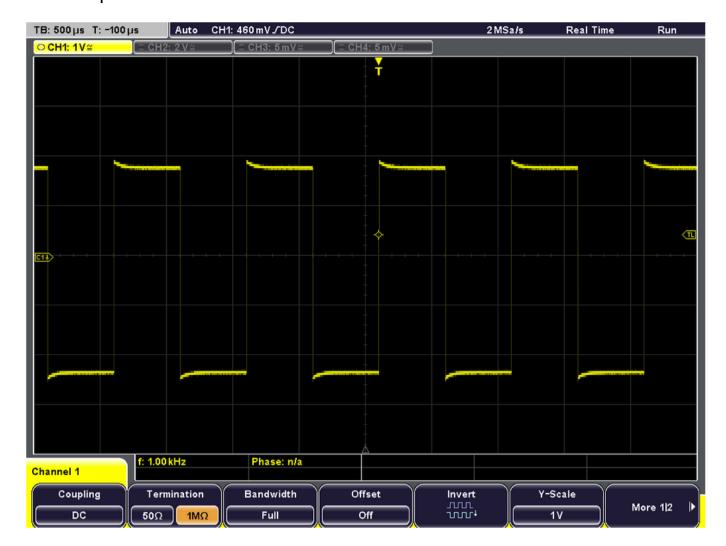
#### 1 kHz Sinewave



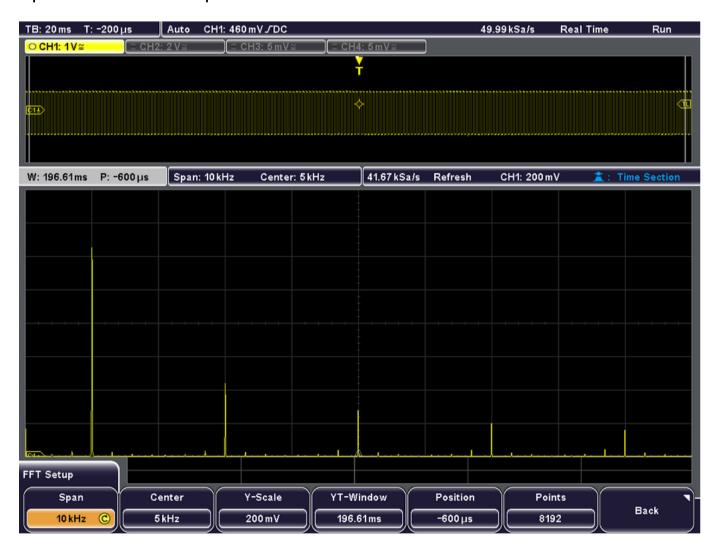
#### Spectrum of 1kHz sinewave



#### 1 kHz Squarewave

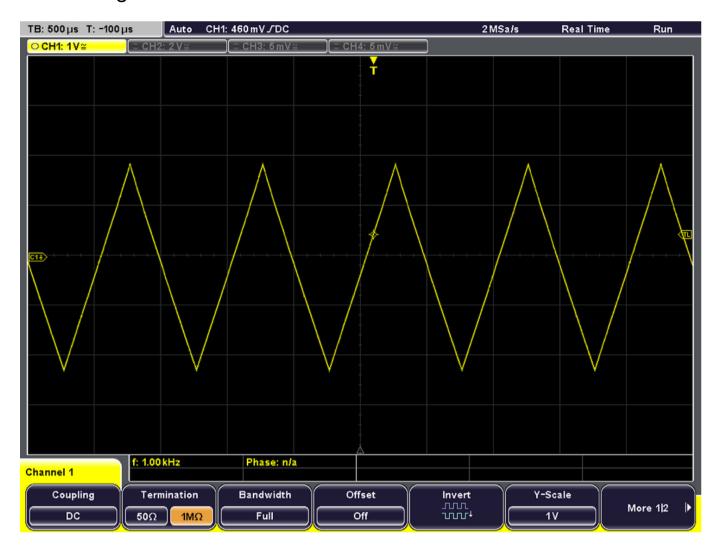


#### Spectrum of 1kHz square wave

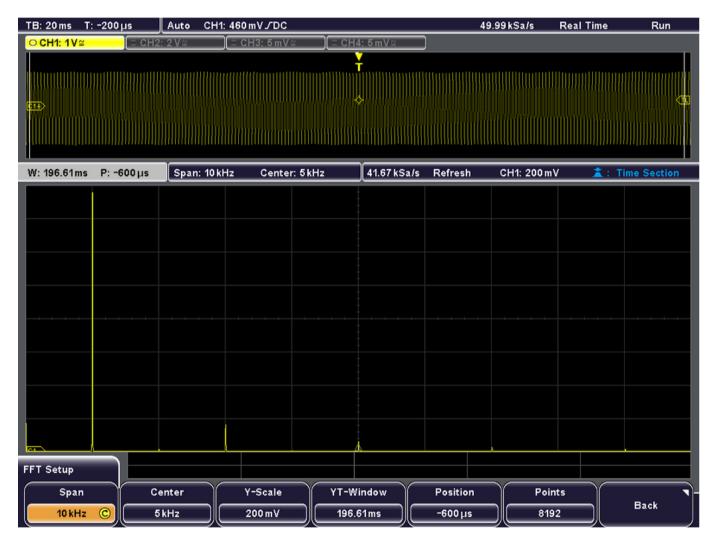


Clearly showing peaks at fundamental, 1/3, 1/5, 1/7 and 1/9 at 3rd, 5th and 7th harmonic frequencies. Note for the square wave, harmonics decline in amplitude as the reciprocal of the harmonic number n.

#### 1 kHz triangle waveform



#### Spectrum of 1kHz triangle waveform



Clearly showing peaks at fundamental, 1/9, 1/25, 1/7 and 1/49 at 3rd, 5th and 7th harmonic frequencies. Note for the triangle waveform, harmonics decline in amplitude as the reciprocal of the square of n.

## Wave Analysis

- <u>Jean Baptiste Joseph Fourier</u> (21 March 1768 16 May 1830) discovered that any **periodic** signal could be represented as a series of *harmonically related* sinusoids.
- An *harmonic* is a frequency whose value is an integer multiple of some *fundamental frequency*
- For example, the frequencies 2 MHz, 3 Mhz, 4 MHz are the second, third and fourth harmonics of a sinusoid with fundamental frequency 1 Mhz.

#### The Trigonometric Fourier Series

Any periodic waveform f(t) can be represented as

$$f(t) = \frac{1}{2}a_0 + a_1\cos\Omega_0t + a_2\cos2\Omega_0t + a_3\cos3\Omega_0t + \dots + a_n\cos n\Omega_0t + \dots + b_1\sin\Omega_0t + b_2\sin2\Omega_0t + b_3\sin3\Omega_0t + \dots + b_n\sin n\Omega_0t + \dots$$

$$(47)$$

or equivalently (if more confusingly)

$$f(t) = \frac{1}{2}a_0 + \sum_{n=1}^{\infty} \left(a_n \cos n\Omega_0 t + b_n \sin n\Omega_0 t\right) \tag{48}$$

where  $\Omega_0$  rad/s is the fundamental frequency.

#### **Notation**

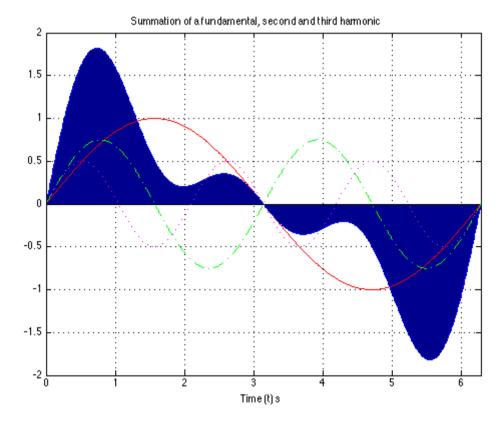
- The first term  $a_o/2$  is a constant and represents the DC (average) component of the signal f(t)
- The terms with coefficients  $a_1$  and  $b_1$  together represent the fundamental frequency component of f(t) at frequency  $\Omega_0$ .
- The terms with coefficients  $a_2$  and  $b_2$  together represent the second harmonic frequency component of f(t) at frequency  $2\Omega_0$ .

And so on.

Since any periodic function f(t) can be expressed as a Fourier series, it follows that the sum of the DC, fundamental, second harmonic and so on must produce the waveform f(t).

#### Sums of sinusoids

In general, the sum of two or more sinusoids does not produce a sinusoid as shown below.



To generate this picture use <u>fourier\_series1.m</u>.

#### Evaluation of the Fourier series coefficients

The coefficients are obtained from the following expressions (valid for any periodic waveform with fundamental frequency  $\Omega_0$  so long as we integrate over one period  $0 \to T_0$  where  $T_0 = 2\pi/\Omega_0$ ), and  $\theta = \Omega_0 t$ :

$$\frac{1}{2}a_0 = \frac{1}{T_0} \int_0^{T_0} f(t)dt = \frac{1}{\pi} \int_0^{2\pi} f(\theta)d\theta \tag{49}$$

$$a_n = \frac{1}{T_0} \int_0^{T_0} f(t) \cos n\Omega_0 t \, dt = \frac{1}{2\pi} \int_0^{2\pi} f(\theta) \cos n\theta \, d\theta$$
 (50)

$$b_n = rac{1}{T_0} \int_0^{T_0} f(t) \sin n\Omega_0 t \, dt = rac{1}{2\pi} \int_0^{2\pi} f( heta) \sin n heta \, d heta$$
 (51)

## Odd, Even and Half-wave Symmetry

#### Odd and even symmetry

- An odd function is one for which f(t) = -f(-t). The function  $\sin t$  is an odd function.
- An even function is one for which f(t)=f(-t). The function  $\cos t$  is an even function.

#### Half-wave symmetry

- A periodic function with period T is a function for which f(t)=f(t+T)
- ullet A periodic function with period T, has half-wave symmetry if f(t)=-f(t+T/2)

### Symmetry in Trigonometric Fourier Series

There are simplifications we can make if the original periodic properties has certain properties:

- If f(t) is odd,  $a_0=0$  and there will be no cosine terms so  $a_n=0 \; orall n>0$
- If f(t) is even, there will be no sine terms and  $b_n=0 \ \forall n>0$ . The DC may or may not be zero.
- If f(t) has half-wave symmetry only the odd harmonics will be present. That is  $a_n$  and  $b_n$  is zero for all even values of n (0, 2, 4, ...)

#### Some simplifications that result from symmetry

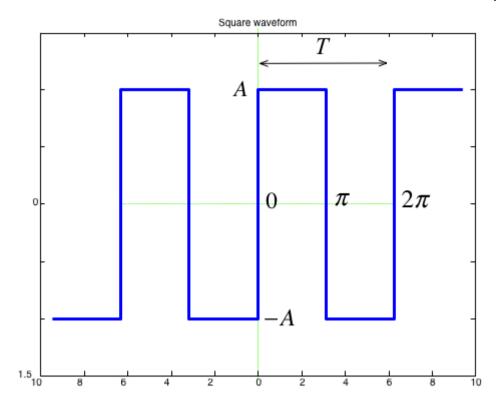
- The limits of the integrals used to compute the coefficients  $a_n$  and  $b_n$  of the Fourier series are given as  $0 \to 2\pi$  which is one period T
- We could also choose to integrate from  $-\pi o \pi$
- If the function is odd, or even or has half-wave symmetry we can compute  $a_n$  and  $b_n$  by integrating from  $0 \to \pi$  and multiplying by 2.
- If we have *half-wave symmetry* we can compute  $a_n$  and  $b_n$  by integrating from  $0 o \pi/2$  and multiplying by 4.

(For more details see page 7-10 of [Karris, 2012])

## Computing coefficients of Trig. Fourier Series in MATLAB

The computation of the coefficients of the trig. fourier series is a painstaking, error-prone process and we need to use a computer.

As an example let's take a square wave with amplitude  $\pm A$  and period T.



#### Solution

```
clear all
cd ../matlab
format compact
```

```
syms t n A pi
n = [1:11];
```

DC component

```
half_a0 = 1/(2*pi)*(int(A,t,0,pi)+int(-A,t,pi,2*pi))
```

```
half_a0 =
```

0

Compute harmonics

```
ai = 1/pi*(int(A*cos(n*t),t,0,pi)+int(-A*cos(n*t),t,pi,2*pi));
bi = 1/pi*(int(A*sin(n*t),t,0,pi)+int(-A*sin(n*t),t,pi,2*pi));
```

Reconstruct f(t) from harmonic sine functions

```
ft = half_a0;
for k=1:length(n)
   ft = ft + ai(k)*cos(k*t) + bi(k)*sin(k*t);
end;
```

Make numeric

```
ft_num = subs(ft,A,1.0);
```

Print using 4 sig digits

```
ft_num = vpa(ft_num, 4)
```

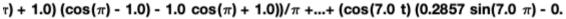
```
ft_num =
```

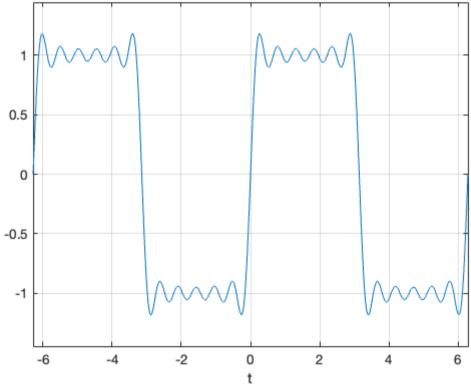
```
 (\sin(t)*((2.0*\cos(pi) + 1.0)*(\cos(pi) - 1.0) - 1.0*\cos(pi) + 1.0))/pi + (\cos(4.0*t)*(0.5*\sin(4.0*pi) - 0.25*\sin(8.0*pi)))/pi + (\cos(8.0*t)*(0.25*\sin(8.0*pi) - 0.125*\sin(16.0*pi)))/pi + (\sin(5.0*t)*(0.2*\cos(10.0*pi) - 0.2*\cos(5.0*pi) + 0.4*\sin(2.5*pi)^2))/pi + (\sin(10.0*t)*(0.1*\cos(20.0*pi) - 0.1*\cos(10.0*pi) + 0.2*\sin(5.0*pi)^2))/pi + (\sin(9.0*t)*(0.1111*\cos(18.0*pi) - 0.1111*\cos(9.0*pi) + 0.2222*\sin(4.5*pi)^2))/pi + (\sin(11.0*t)*(0.09091*\cos(22.0*pi) - 0.09091*\cos(11.0*pi) + 0.1818*\sin(5.5*pi)^2))/pi + (\sin(3.0*t)*(0.3333*\cos(6.0*pi) - 0.3333*\cos(3.0*pi) + 0.6667*\sin(1.5*pi)^2))/pi + (\sin(6.0*t)*(0.1667*\cos(12.0*pi) - 0.1667*\cos(6.0*pi) + 0.3333*\sin(3.0*pi)^2))/pi + (\sin(7.0*t)*(0.1429*\cos(14.0*pi) - 0.1429*\cos(7.0*pi) + 0.2857*\sin(3.5*pi)^2))/pi + (\sin(2.0*t)*(\sin(pi)^2 + \sin(pi)^2*(4.0*sin(pi)^2 - 3.0)))/pi + (\sin(4.0*t)*(0.25*\cos(8.0*pi) - 0.25*\cos(4.0*pi) + 0.5*sin(2.0*pi)^2))/pi + (\sin(8.0*t)*(0.125*\cos(16.0*pi) - 0.125*\cos(8.0*pi) + 0.25*sin(4.0*pi)^2))/pi + (\cos(9.0*t)*(0.2222*sin(9.0*pi) - 0.1111*sin )
```

```
\begin{array}{l} (18.0*\text{pi})))/\text{pi} + (\cos(5.0*\text{t})*(0.4*\sin(5.0*\text{pi}) - 0.2*\sin(10.0*\text{pi})))/\text{pi} + \\ (\cos(10.0*\text{t})*(0.2*\sin(10.0*\text{pi}) - 0.1*\sin(20.0*\text{pi})))/\text{pi} + (\cos(2.0*\text{t})*\\ (0.5*\sin(2.0*\text{pi}) + 0.5*\sin(2.0*\text{pi})*(4.0*\sin(\text{pi})^2 - 1.0)))/\text{pi} + (\cos(11.0*\text{t})*\\ (0.1818*\sin(11.0*\text{pi}) - 0.09091*\sin(22.0*\text{pi})))/\text{pi} + (\cos(3.0*\text{t})*\\ (0.6667*\sin(3.0*\text{pi}) - 0.3333*\sin(6.0*\text{pi})))/\text{pi} + (\cos(6.0*\text{t})*\\ (0.3333*\sin(6.0*\text{pi}) - 0.1667*\sin(12.0*\text{pi})))/\text{pi} + (\cos(t)*(\sin(\text{pi}) - 1.0*\sin(\text{pi})*(2.0*\cos(\text{pi}) - 1.0)))/\text{pi} + (\cos(7.0*\text{t})*(0.2857*\sin(7.0*\text{pi}) - 0.1429*\sin(14.0*\text{pi})))/\text{pi} \end{array}
```

Plot result

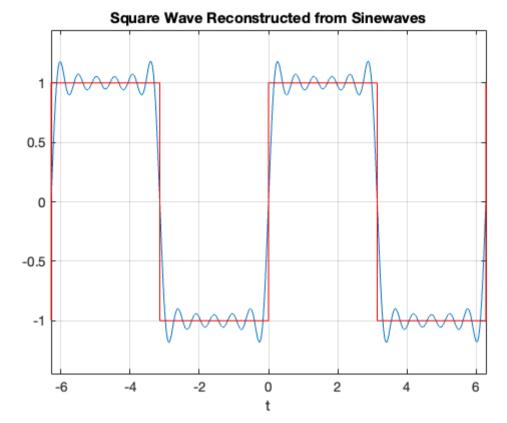
```
ezplot(ft_num),grid
```





Plot original signal (we could use heaviside for this as well)

```
ezplot(ft_num)
hold on
clear pi
t = [-3,-2,-2,-2,-1,-1,-1,0,0,0,1,1,1,2,2,2,3]*pi;
f = [-1,-1,0,1,1,0,-1,-1,0,1,1,0,-1,-1,0,1,1];
plot(t,f,'r-')
grid
title('Square Wave Reconstructed from Sinewaves')
hold off
```



To run the full solution yourself download and run square ftrig.mlx.

The Result confirms that:

- $a_0 = 0$
- $a_i = 0$ : function is odd
- ullet  $b_i=0$ : for i even half-wave symmetry

Note that the coefficients match those given in the textbook (Section 7.4.1).

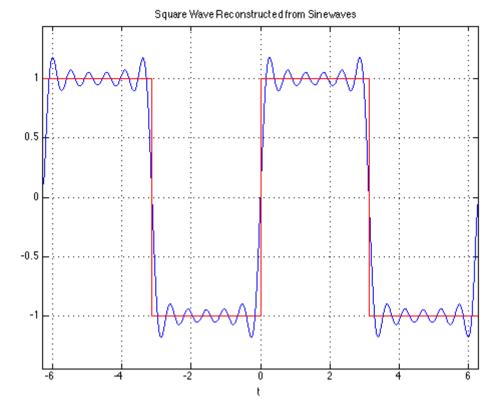
$$f(t) = rac{4A}{\pi}igg(\sin\Omega_0 t + rac{1}{3}\sin3\Omega_0 t + rac{1}{5}\sin5\Omega_0 t + \cdotsigg) = rac{4A}{\pi}\sum_{n=\mathrm{odd}}rac{1}{n}\sin n\Omega_0 t$$

### Gibbs Phenomenon

In an earlier slide we found that the trigonometric for of the Fourier series of the square waveform is

$$f(t) = rac{4A}{\pi}igg(\sin\Omega_0 t + rac{1}{3}\sin3\Omega_0 t + rac{1}{5}\sin5\Omega_0 t + \cdotsigg) = rac{4A}{\pi}\sum_{n= ext{odd}}rac{1}{n}\sin n\Omega_0 t$$

This figure shows the approximation for the first 11 harmonics:



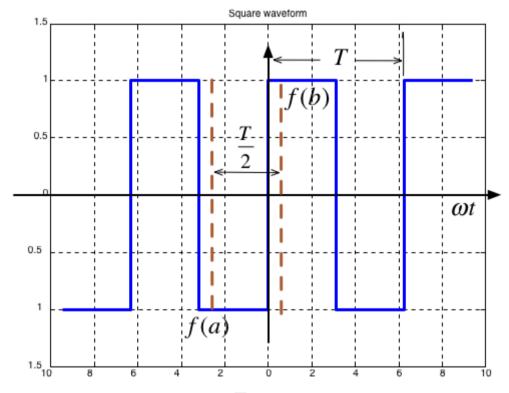
As we add more harmonics, the sum looks more and more like a square wave. However the crests do not become flattened; this is known as *Gibbs Phenomenon* and it occurs because of the discontinuity of the perfect square waveform as it changes from +A to -A and *vice versa*.

## Example 16.1: Symmetry in Common Waveforms

To reproduce the following waveforms (without annotation) publish the script waves.m.

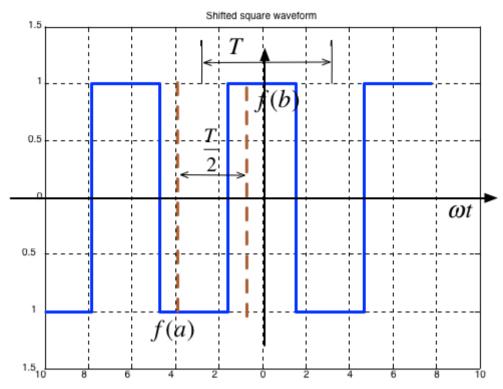
For each of the following, determine the average value of the waveform over 1 period, state whether it is even or odd, determine if the waveform has halfwave symmetry f(t)=-f(t+T/2).

### a) Squarewave



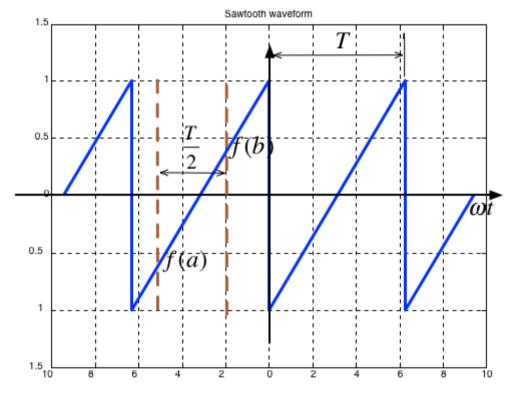
- Average value over period T is ...?
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t) = -f(t+T/2)?

## b) Shifted Squarewave



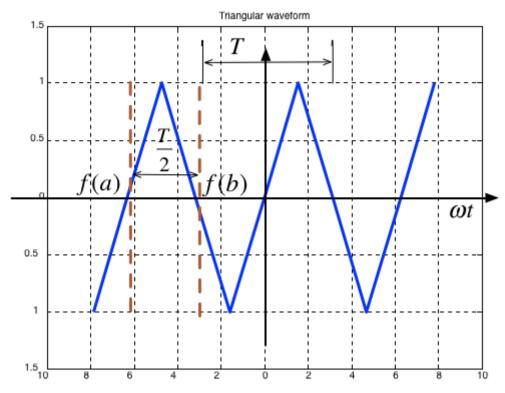
- $\bullet\,$  Average value over period T is
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t)=-f(t+T/2)?

## c) Sawtooth



- $\bullet\,$  Average value over period T is
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t)=-f(t+T/2)?

### Triangle



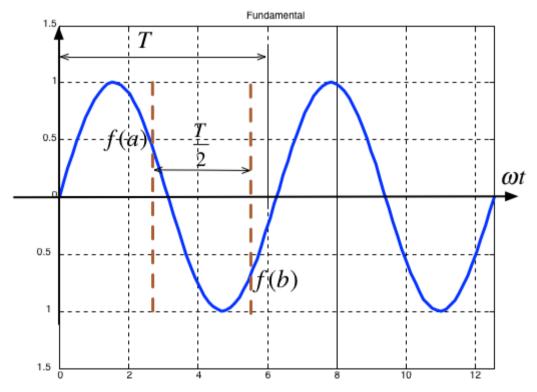
- ullet Average value over period T is
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t)=-f(t+T/2)?

# Example 16.2: Symmetry in fundamental, Second and Third Harmonics

In the following, T/2 is taken to be the half-period of the fundamental sinewave.

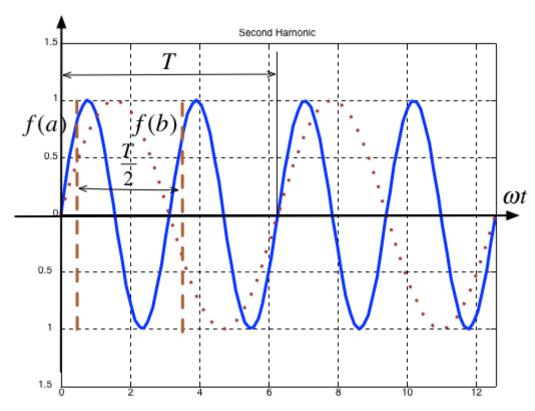
Evaluate the symmetry of the following fundamental and harmonic frequencies.

## a) Fundamental



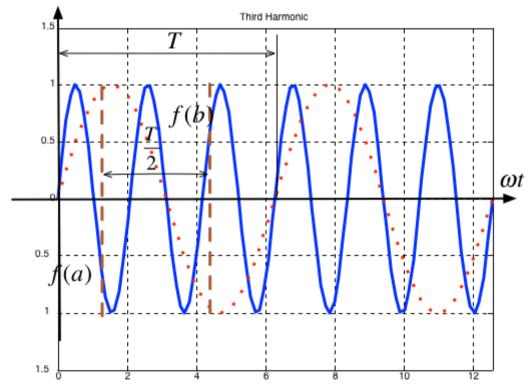
- ullet Average value over period T is
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t)=-f(t+T/2)?

## b) Second Harmonic



- ullet Average value over period T is
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t)=-f(t+T/2)?

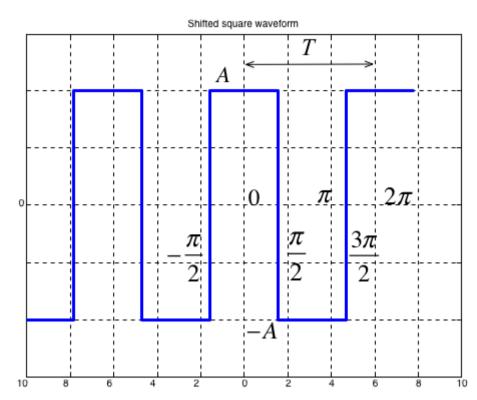
## b) Third Harmonic



- ullet Average value over period T is
- It is an **odd/even** function?
- It has/has not half-wave symmetry f(t)=-f(t+T/2)?

Example 16.3: Using symmetry - computing the Fourier series coefficients of the shifted

#### square wave



Calculation of Fourier coefficients for Shifted Square Wave Exploiting half-wave symmetry. This is almost the same procedure as illustrated in <u>Computing coefficients of Trig. Fourier Series in MATLAB</u>.

You can confirm the results by downloading and executing this file: shifted sq ftrig.mlx.

```
clear all syms t n A pi
```

Define harmonics

```
n = [1:11];
```

DC component

```
half_a0 = 0
```

Compute harmonics - use half-wave symmetry

```
ai = 4/pi*int(A*cos(n*t),t,0,pi/2);
```

```
bi = zeros(size(n));
```

Reconstruct f(t) from harmonic sine functions

```
ft = half_a0;
for k=1:length(n)
   ft = ft + ai(k)*cos(k*t) + bi(k)*sin(k*t);
end
```

Make numeric and print to 4 sig. figs.

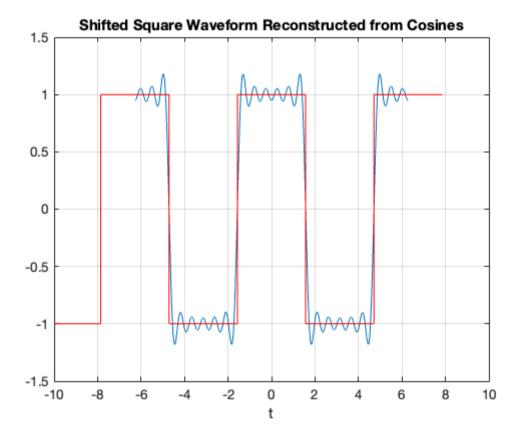
```
ft_num = subs(ft,A,1.0);
ft_num = vpa(ft_num, 4)
```

```
ft_num =
```

```
(cos(4.0*t)*sin(2.0*pi))/pi + (0.5*cos(8.0*t)*sin(4.0*pi))/pi +
(0.4444*cos(9.0*t)*sin(4.5*pi))/pi + (0.8*cos(5.0*t)*sin(2.5*pi))/pi +
(0.4*cos(10.0*t)*sin(5.0*pi))/pi + (0.3636*cos(11.0*t)*sin(5.5*pi))/pi +
(1.333*cos(3.0*t)*sin(1.5*pi))/pi + (0.6667*cos(6.0*t)*sin(3.0*pi))/pi +
(0.5714*cos(7.0*t)*sin(3.5*pi))/pi + (4.0*sin(0.5*pi)*cos(t))/pi +
(2.0*cos(2.0*t)*sin(pi))/pi
```

plot result and overlay original signal (we could use heaviside for this as well.

```
clear pi
ezplot(ft_num)
hold on
t = [-3,-2,-2,-2,-1,-1,-1,0,0,0,1,1,1,2,2,2,3]*pi;
f = [-1,-1,0,1,1,0,-1,-1,0,1,1,0,-1,-1,0,1,1];
plot(t-pi/2,f,'r-')
axis([-10,10,-1.5,1.5])
grid
title('Shifted Square Waveform Reconstructed from Cosines')
hold off
```



- As before  $a_0=0$
- We observe that this function is even, so all  $b_k$  coefficents will be zero
- The waveform has half-wave symmetry, so only odd indexed coefficents will be present.
- Further more, because it has half-wave symmetry we can just integrate from  $0 \to \pi/2$  and multiply the result by 4.

Note that the coefficients match those given in the {cite|karris (Section 7.4.2).

$$f(t) = rac{4A}{\pi}igg(\cos\Omega_0 t - rac{1}{3}\cos3\Omega_0 t + rac{1}{5}\cos5\Omega_0 t - \cdotsigg) = rac{4A}{\pi}\sum_{n= ext{odd}}(-1)^{rac{n-1}{2}}rac{1}{n}\cos n\Omega_0$$

## Summary

In this unit we ...

- Introduction
- Periodic Signals
- Motivating Examples
- Wave Analysis
- Odd, Even and Half-wave Symmetry
- Computing coefficients of Trig. Fourier Series in MATLAB
- Gibbs Phenomenon
- Examples 16

#### Takeaways

## **Next Time**

We move on to consider

• Unit 5.2: Exponential Fourier Series

## References

[Hsu20] Hwei P. Hsu. Schaums outlines signals and systems. McGraw-Hill, New York, NY, 2020. ISBN 9780071634724. Available as an eBook. URL: <a href="https://www.accessengineeringlibrary.com/content/book/9781260454246">https://www.accessengineeringlibrary.com/content/book/9781260454246</a>.

[Kar12](1,2) Steven T. Karris. Signals and systems with MATLAB computing and Simulink modeling. Orchard Publishing, Fremont, CA., 2012. ISBN 9781934404232. Library call number: TK5102.9 K37 2012. URL: <a href="https://ebookcentral.proquest.com/lib/swansea-ebooks/reader.action?docID=3384197">https://ebookcentral.proquest.com/lib/swansea-ebooks/reader.action?docID=3384197</a>.

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