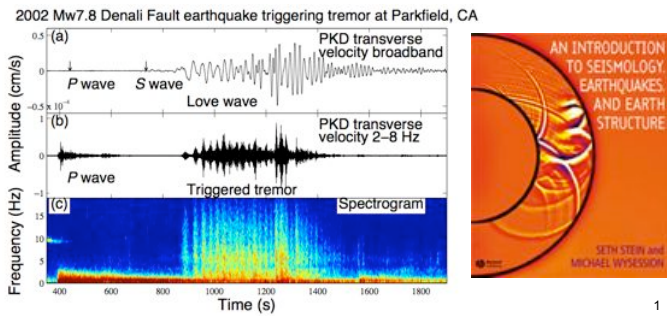


EAS 8803 - Observational Seismology

Lec#1: Introduction, Fourier Series

Dr. Zhigang Peng, Spring 2011



Today's Outline

- Course Introduction
 - Class logistics, requirements and policies
 - Class schedule
- Introduction to digital signal processing and its relation to seismological research
- Fourier series/transform

Reading: Stein and Wysession Chap. 6.1 – 6.2

1/18/11

zpeng Obs Seismology

2

Time and Place

- Lecture Time: M,W 3:05 pm – 4:25 pm
- Lecture Place: ES & T, L1116
- My office hour: M,W 1:30 pm – 2:30 pm

Class website:

http://geophysics.eas.gatech.edu/people/zpeng/Teaching/ObsSeis_2011/

1/18/11

zpeng Obs Seismology

3

Course Goals

- This is an advanced-level course designed to involve students into seismological research.
- The topics covered include digital signal processing, seismometers and seismic networks, basic and advanced seismic data processing tools, travel time and synthetic seismogram calculations, and modern topics in observational and computational seismology.

1/18/11

zpeng Obs Seismology

4

Grading

- 4 homework (40%)
- 3 weeks of paper reading and discussion (30%)
- Term paper project (30%)

1/18/11

zpeng Obs Seismology

5

Course outline – 1st half

- **Digital Signal Processing**
 1. Fourier analysis
 2. Linear systems
 3. Discrete time series and transforms
- **Seismometers, Seismic Networks, and Data Centers**
 1. Historical development and the Earth's background noise
 2. The damped harmonic oscillator and instrument response
 3. Basic types of seismic sensors and digital recording devices
 4. Global and regional seismic networks and data management centers
 5. **Optional Field Trip to Costa Rica**
- **Observational Seismology**
 1. Basic data processing tools
 2. Data management
 3. Waveform stacking
 4. Array analysis

1/18/11

zpeng Obs Seismology

6

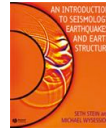
Course outline - 2nd half

- **Theoretical and Computational Seismology**
 1. Ray theory and travel time calculation
 2. Theoretical seismogram calculation
 3. Earthquake location and tomography
 4. Scattering
- **Current topics in observational and computational seismology**
 1. Ambient noise tomography and seismic interferometry
 2. Waveform back projection for imaging earthquake ruptures
 3. Spectral-element methods (SEM) and full-waveform tomography

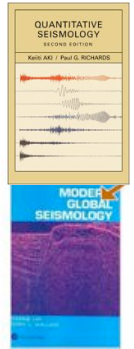
1/18/11

zpeng Obs Seismology

7



Text Book



Required:

S. Stein and M. Wysession, *An Introduction to Seismology, Earthquakes, and Earth Structure* Blackwell Publishing.

Recommended:

K. Aki and P.G. Richards, *Quantitative Seismology* W.H. Freeman and Co.

T. Lay and T.C. Wallace, *Modern Global Seismology*, Academic Press.

Additional material will be either handed out in class or made available on the course website.

1/18/11

zpeng Obs Seismology

8

Why seismology is interesting?

- Seismology (wikipedia): is the scientific study of earthquakes and the movement of waves through the Earth.
- Earthquakes, and other earth movements, produce different types of seismic waves.
- These waves travel through rock, and provide an effective way to "see" events and structures deep in the Earth.
- What are other types of events (not earthquakes) generating seismic signals?

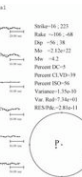
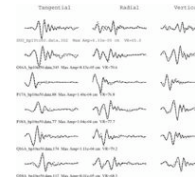
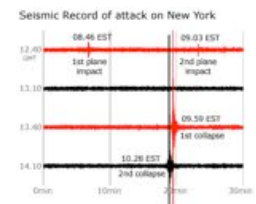


1/18/11

zpeng Obs Seismology

9

Man-made signals



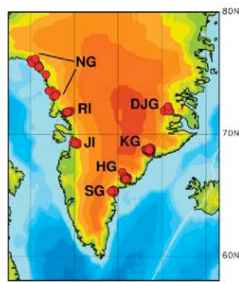
<http://news.bbc.co.uk/1/hi/sci/tech/1554560.stm>

<http://seismo.berkeley.edu/~peggy/Utah20070806.htm>

1/18/11

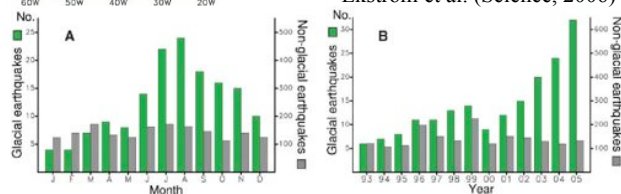
zpeng Obs Seismology

10



Other natural events that generate seismic waves: Glacial earthquakes in Greenland. Evidence of global warming?

Ekström et al. (Science, 2006)



1/18/11

zpeng Obs Seismology

11

Signal and Noise

- What is the definition of **signal** and **noise**?
- “We shall introduce the concepts of **signal** and **noise**. We define the **signal** as the desired part of the data and the **noise** as the unwanted part”.
- “Our definition of **signal** and **noise** is subjective in the sense that a given part of the data is “**signal**” for those who know how to analyze and interpret the data, but it is “**noise**” for those who do not”.



Aki and Richards, *Quantitative Seismology*, 1980

1/18/11

zpeng Obs Seismology

12

Signal and Noise

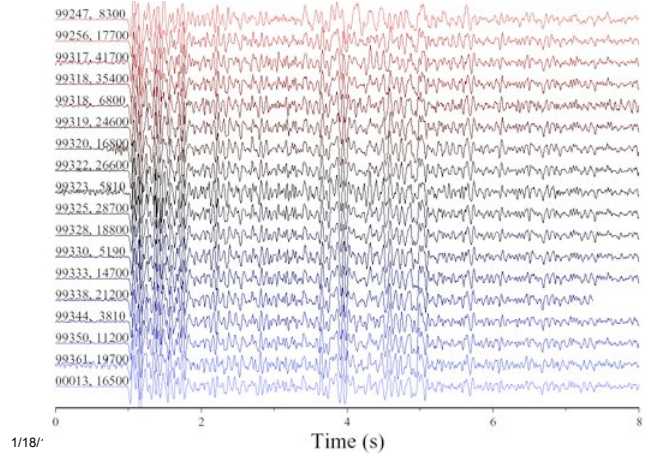


- “For example, for many years the times of the first arrivals of P- and S-waves were the only **signals** conveyed by an earthquake, and the rest of the seismograms, such as surface waves and coda waves, had to be considered as useless until appropriate methods of interpretations were found.
- Thus, through the application of a new technique to old data, an analyst (seismologists) can experience a moment of discovery as joyful as a data gather does using a new observational device.”

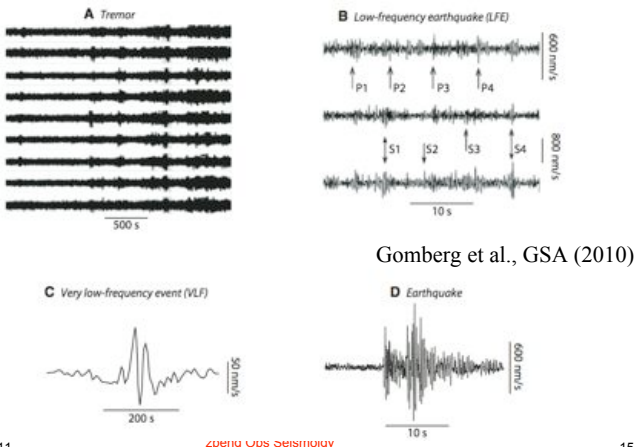
Can you think of any examples of noise turning into signal in the field of seismology?



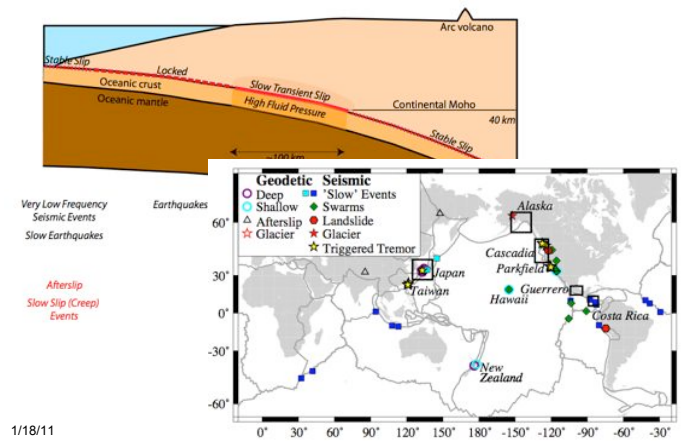
Example 1: coda waves



Example 2: Non-volcanic tremors



Global observations of slow-slip phenomena (Peng and Gomberg, NCEO, 2010)



Example 3: Ambient noise tomography

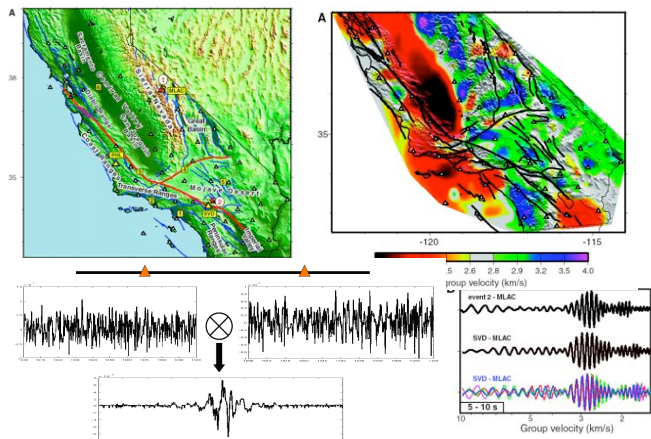
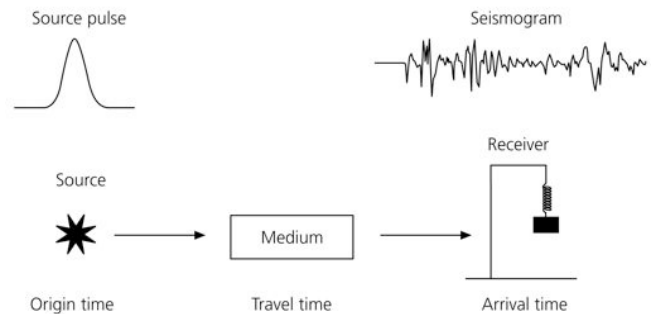


Figure 1.1-1: Schematic geometry of a seismic experiment.



Filtering: applying some operations that modifies the signal.
 The Earth is a “low-pass filter”.
 A seismometer is a “band-pass filter”.

Relation between seismology and signal processing

- **Seismology** uses various techniques to study the **displacement** (or velocity, acceleration) as a function of **position** and **time** associated with **elastic waves**, and to draw conclusions about the **seismic sources** and the **earth**.
- A major task in **seismology** is to separate the **source**, **path** and **site** effects in order to study each of them in details.

1/18/11

zpeng Obs Seismology

19

Relation between seismology and signal processing

- **Signal processing** (or time series analysis) considers functions of space or time in general terms with regard to the specific physics involved.
- Hence, many wave propagation subjects, including **seismology**, radar, sonar, and optics, can be treated in similar ways via **signal processing** technique.

1/18/11

zpeng Obs Seismology

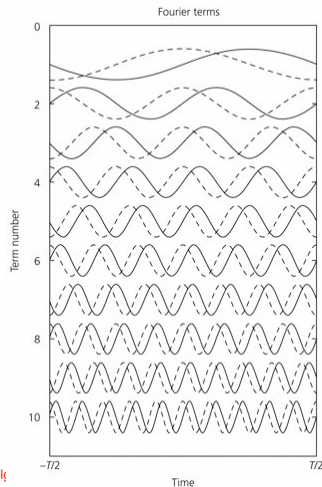
20



Fourier analysis

- Any time series can be decomposed into the sum or integral of harmonic waves of different frequencies.
- Harmonic waves: a sinusoid with a single frequency.

Figure 6.2-1: Successive terms of a Fourier series.



1/18/11

zpeng Obs Seismology

Fourier Series

- To find the coefficients a_n and b_n :

$$\int_{-T/2}^{T/2} \cos\left(\frac{2k\pi t}{T}\right) f(t) dt = \int_{-T/2}^{T/2} \cos\left(\frac{2k\pi t}{T}\right) \left[a_0 + \sum_{n=1}^{\infty} a_n \cos\left(\frac{2n\pi t}{T}\right) + \sum_{n=1}^{\infty} b_n \sin\left(\frac{2n\pi t}{T}\right) \right] dt$$

- The only nonzero term is $\cos(2\pi kt/T)$, so

$$\int_{-T/2}^{T/2} \cos\left(\frac{2k\pi t}{T}\right) f(t) dt = \int_{-T/2}^{T/2} \cos^2\left(\frac{2k\pi t}{T}\right) dt = \frac{T}{2} a_k (1 + \delta_{k0}),$$

$$a_k = \frac{2 - \delta_{k0}}{T} \int_{-T/2}^{T/2} \cos\left(\frac{2k\pi t}{T}\right) f(t) dt \quad a_0 = \frac{1}{T} \int_{-T/2}^{T/2} f(t) dt$$

$$b_k = \frac{2}{T} \int_{-T/2}^{T/2} \sin\left(\frac{2k\pi t}{T}\right) f(t) dt$$

1/18/11

zpeng Obs Seismology

22

Figure 6.2-2: First ten terms of the Fourier series for a ramp function.

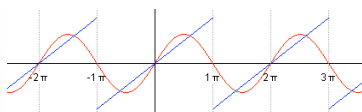
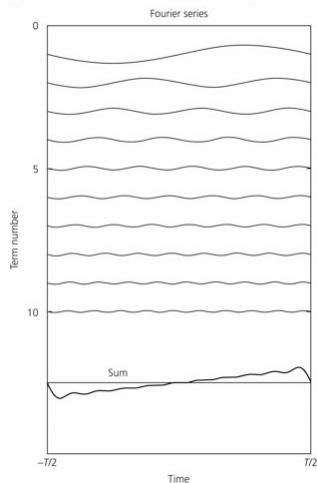
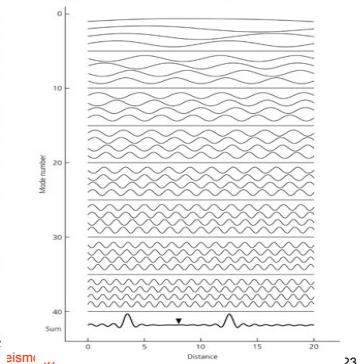


Figure 2.2-8: Waves on a string as a summation of modes.



1/18/11

zpeng Obs Seismology

23

Complex Fourier Series

- The Fourier series can be written in a simpler form by expanding the sine and cosine functions into complex exponentials, so that the Fourier series becomes

$$f(t) = F_0 + \sum_{n=1}^{\infty} [F_n e^{i\omega_n t} + F_{-n} e^{-i\omega_n t}]$$

- The negative exponentials can be written as

$$\sum_{n=1}^{\infty} F_{-n} e^{-i\omega_n t} = \sum_{n=-1}^{-\infty} F_n e^{i\omega_n t}$$

- So the Fourier series can be written in complex number form as:

$$f(t) = \sum_{n=-\infty}^{\infty} F_n e^{i\omega_n t} \quad F_n = \frac{1}{T} \int_{-T/2}^{T/2} e^{-i\omega_n t} f(t) dt$$

1/18/11

zpeng Obs Seismology

24

From Fourier Series to Fourier Transforms

- Fourier Series: a time series expressed in terms of a sum over discrete angular frequencies $\varpi_n = 2n\pi / T$
- Fourier Transforms: a time series expressed as an integral of a continuous range of angular frequencies.
- Fourier Transforms are used in most seismological application, because we regard the waves as continuous functions of angular frequencies

1/18/11

zpeng Obs Seismology

25

From Fourier Series to Fourier Transforms

- Rewrite $f(t) = \sum_{n=-\infty}^{\infty} F_n e^{i\varpi_n t} = \sum_{n=-\infty}^{\infty} F_n e^{i\varpi_n t} \Delta n$
 - where $\Delta n = 1$.
 - Since $\Delta\varpi = 2\pi / T\Delta n$
 - so that $\Delta n = (T / 2\pi)\Delta\varpi$
 - and $f(t) = \sum_{n=-\infty}^{\infty} F_n e^{i\varpi_n t} (T / 2\pi)\Delta\varpi$
 - If we let the period T go to infinity,
- $$f(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} F(\varpi) e^{i\varpi t} d\varpi \quad F(\varpi) = \int_{-\infty}^{\infty} e^{-i\varpi t} f(t) dt$$

1/18/11

zpeng Obs Seismology

26

Fourier Transforms

- If $f(t)$ is a seismogram that has the dimensions of displacement, its Fourier transform $F(\omega)$ has the dimensions of displacement multiplied by time (from the dt term).
- The Fourier transform can be written in terms of two real-valued functions of ω :

$$F(\varpi) = |F(\varpi)| e^{i\phi(\varpi)} \quad \text{Amplitude spectrum}$$

$$|F(\varpi)| = [F(\varpi)F^*(\varpi)]^{1/2} = [\text{Re}^2(F(\varpi)) + \text{Im}^2(F(\varpi))]^{1/2}$$

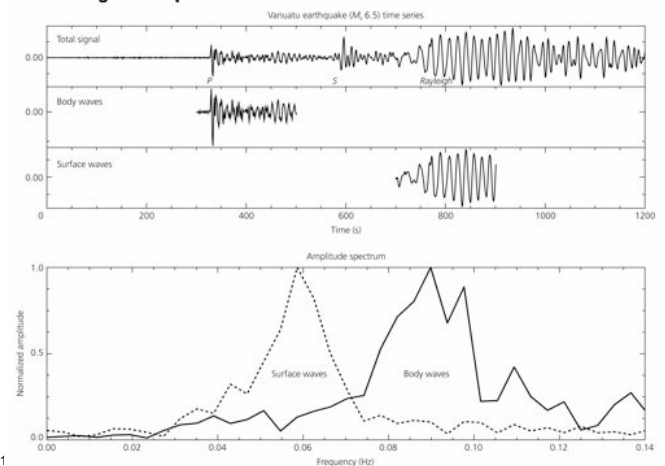
$$\phi(\varpi) = \tan^{-1}(\text{Im}(F(\varpi)) / \text{Re}(F(\varpi))) \quad \text{Phase spectrum}$$

1/18/11

zpeng Obs Seismology

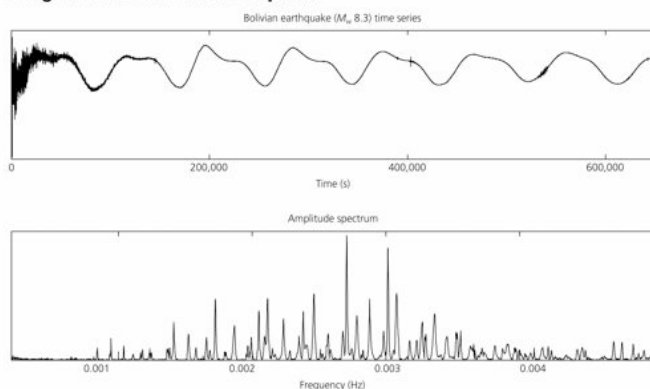
27

Figure 6.2-3: Amplitude spectra for the body and surface wave segments from a large earthquake.



1

Figure 6.2-4: Amplitude spectra of a vertical-component seismogram from the great 1994 Bolivian earthquake.



1/18/11

zpeng Obs Seismology

29

Time and frequency domain

- Time domain: time series $f(t)$
- Frequency domain: $F(\omega)$
- Can you think of another pairs of representation in different domain?
- Spatial domain: Distance (d , or wavelength)
- Wavenumber domain: wavenumber (k)

1/18/11

zpeng Obs Seismology

30

Properties of Fourier Transform (I)

- The Fourier transform is linear: if $F(\omega)$ and $G(\omega)$ are the transforms of $f(t)$ and $g(t)$, then $(aF(\omega) + bG(\omega))$ is the transform of $(af(t) + bg(t))$.
- The Fourier transform of a purely real time function has the symmetry

$$F(-\omega) = F^*(\omega)$$

1/18/11

zpeng Obs Seismolgy

31

Properties of Fourier Transform (II)

- The Fourier transform of a time series shifted in time is found by changing the phase of the transform: if the transform of $f(t)$ is $F(\omega)$, the transform of $f(t-a)$ is $e^{-i\omega a}F(\omega)$
- Similarly, shifting of a Fourier transform in frequency domain causes a phase change in the corresponding time series: the inverse transform of $F(\omega-a)$ is $e^{iat}f(t)$

1/18/11

zpeng Obs Seismolgy

32

Properties of Fourier Transform (III)

- The Fourier transform of the derivative of a time function is found by multiplication: $(i\omega)F(\omega)$ is the transform of $df(t)/dt$.
- This makes differentiation easy in the frequency domain, and make it easy to solve differential equations.
- The total energy in a Fourier transform is the same as that in the time series (Parseval theorem):

$$\int_{-\infty}^{\infty} |f(t)|^2 dt = \frac{1}{2\pi} \int_{-\infty}^{\infty} |F(\omega)|^2 d\omega$$

1/18/11

zpeng Obs Seismolgy

33

Today's Outline

- Course Introduction
 - Class logistics, requirements and policies
 - Class schedule
- Introduction to digital signal processing and its relation to seismological research
- Fourier series/transform

Reading: Stein and Wysession Chap. 6.1 – 6.2

1/18/11

zpeng Obs Seismolgy

34

Next time

- Fourier transforms/Linear systems

Reading: Stein and Wysession Chap. 6.1 – 6.2

1/18/11

zpeng Obs Seismolgy

35

"I cannot help feeling that seismology will stay in the place at the center of solid earth science for many, many years to come..."

The joy of being a seismologist comes to you, when you find something new about the earth's interior from the observation of seismic waves obtained on the surface, and realize that you did it without penetrating the earth or touching or examining it directly."

Keiiti Aki, presidential address to the Seismological Society of America, 1980

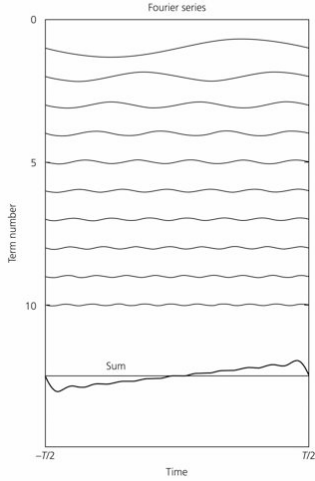


1/18/11

zpeng Obs Seismolgy

36

Figure 6.2.2: First ten terms of the Fourier series for a ramp function.



For a ramp function $f(t) = t/T$,
 performing the integration gives
 $a_k = 0$ $b_k = (-1)^{k+1} / k\pi$
 The cosine terms are zero, why?

Fourier Series

- Decomposition of a signal with a finite duration

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

- The sine and cosine Fourier terms are a set of *orthogonal* functions.

$$\int_{-T/2}^{T/2} \sin\left(\frac{2m\pi t}{T}\right) \sin\left(\frac{2n\pi t}{T}\right) dt = \frac{T}{2} \delta_{mn} (1 - \delta_{m0}),$$

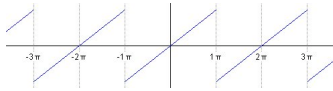
$$\int_{-T/2}^{T/2} \cos\left(\frac{2m\pi t}{T}\right) \cos\left(\frac{2n\pi t}{T}\right) dt = \frac{T}{2} \delta_{mn} (1 + \delta_{m0}),$$

$$\int_{-T/2}^{T/2} \cos\left(\frac{2m\pi t}{T}\right) \sin\left(\frac{2n\pi t}{T}\right) dt = 0 \quad \text{For all } m, n.$$

Simple Fourier series

$$f(x) = x, \quad \text{for } -\pi < x < \pi$$

$$f(x + 2\pi) = f(x), \quad \text{for } -\infty < x < \infty$$



$$a_n = \frac{1}{\pi} \int_{-\pi}^{\pi} f(x) \cos(nx) dx$$

$$= \frac{1}{\pi} \int_{-\pi}^{\pi} x \cos(nx) dx$$

$$= 0.$$

$$b_n = \frac{1}{\pi} \int_{-\pi}^{\pi} f(x) \sin(nx) dx$$

$$= \frac{1}{\pi} \int_{-\pi}^{\pi} x \sin(nx) dx$$

$$= \frac{2}{\pi} \int_0^{\pi} x \sin(nx) dx$$

$$= \frac{2}{\pi} \left(\left[-\frac{x \cos(nx)}{n} \right]_0^{\pi} + \left[\frac{\sin(nx)}{n^2} \right]_0^{\pi} \right)$$

$$= 2 \frac{(-1)^{n+1}}{n}.$$

$$f(x) = \frac{a_0}{2} + \sum_{n=1}^{\infty} [a_n \cos(nx) + b_n \sin(nx)]$$

$$= 2 \sum_{n=1}^{\infty} \frac{(-1)^{n+1}}{n} \sin(nx), \quad \text{for } -\infty < x < \infty.$$