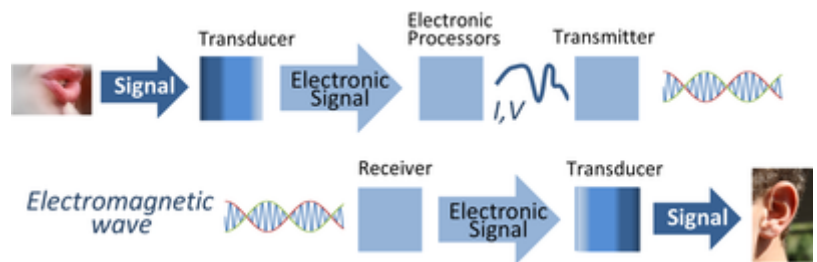
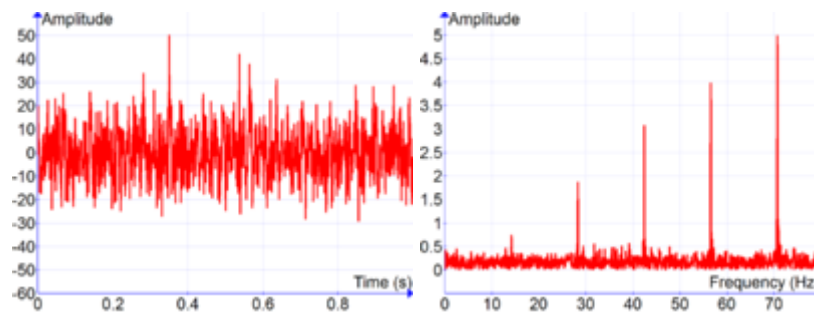


# Signal processing

**Signal processing** is an electrical engineering subfield that focuses on analysing, modifying, and synthesizing *signals* such as sound, images, and scientific measurements.<sup>[1]</sup> Signal processing techniques can be used to improve transmission, storage efficiency and subjective quality and to also emphasize or detect components of interest in a measured signal.<sup>[2]</sup>



Signal transmission using electronic signal processing. Transducers convert signals from other physical waveforms to electric current or voltage waveforms, which then are processed, transmitted as electromagnetic waves, received and converted by another transducer to final form.



The signal on the left looks like noise, but the signal processing technique known as the Fourier transform (right) shows that it contains five well-defined frequency components.

## Contents

### History

### Categories

Analog

Continuous time

Discrete time

Digital

Nonlinear

Statistical

### Application fields

### Typical devices

### Mathematical methods applied

### See also

### References

### Further reading

# History

---

According to Alan V. Oppenheim and Ronald W. Schafer, the principles of signal processing can be found in the classical numerical analysis techniques of the 17th century. They further state that the digital refinement of these techniques can be found in the digital control systems of the 1940s and 1950s.<sup>[3]</sup>

In 1948, Claude Shannon wrote the influential paper "A Mathematical Theory of Communication" which was published in the Bell System Technical Journal.<sup>[4]</sup> The paper laid the groundwork for later development of information communication systems and the processing of signals for transmission.<sup>[5]</sup>

Signal processing matured and flourished in the 1960s and 1970s, and digital signal processing became widely used with specialized digital signal processor chips in the 1980s.<sup>[5]</sup>

# Categories

---

## Analog

Analog signal processing is for signals that have not been digitized, as in most 20th-century radio, telephone, radar, and television systems. This involves linear electronic circuits as well as nonlinear ones. The former are, for instance, passive filters, active filters, additive mixers, integrators, and delay lines. Nonlinear circuits include comandors, multipliers (frequency mixers, voltage-controlled amplifiers), voltage-controlled filters, voltage-controlled oscillators, and phase-locked loops.

## Continuous time

Continuous-time signal processing is for signals that vary with the change of continuous domain (without considering some individual interrupted points).

The methods of signal processing include time domain, frequency domain, and complex frequency domain. This technology mainly discusses the modeling of linear time-invariant continuous system, integral of the system's zero-state response, setting up system function and the continuous time filtering of deterministic signals

## Discrete time

Discrete-time signal processing is for sampled signals, defined only at discrete points in time, and as such are quantized in time, but not in magnitude.

*Analog discrete-time signal processing* is a technology based on electronic devices such as sample and hold circuits, analog time-division multiplexers, analog delay lines and analog feedback shift registers. This technology was a predecessor of digital signal processing (see below), and is still used in advanced processing of gigahertz signals.

The concept of discrete-time signal processing also refers to a theoretical discipline that establishes a mathematical basis for digital signal processing, without taking quantization error into consideration.

## Digital

Digital signal processing is the processing of digitized discrete-time sampled signals. Processing is done by general-purpose computers or by digital circuits such as ASICs, field-programmable gate arrays or specialized digital signal processors (DSP chips). Typical arithmetical operations include fixed-point and floating-point, real-valued and complex-valued, multiplication and addition. Other typical operations supported by the hardware are circular buffers and lookup tables. Examples of algorithms are the fast Fourier transform (FFT), finite impulse response (FIR) filter, Infinite impulse response (IIR) filter, and adaptive filters such as the Wiener and Kalman filters.

## Nonlinear

Nonlinear signal processing involves the analysis and processing of signals produced from nonlinear systems and can be in the time, frequency, or spatio-temporal domains.<sup>[6][7]</sup> Nonlinear systems can produce highly complex behaviors including bifurcations, chaos, harmonics, and subharmonics which cannot be produced or analyzed using linear methods.

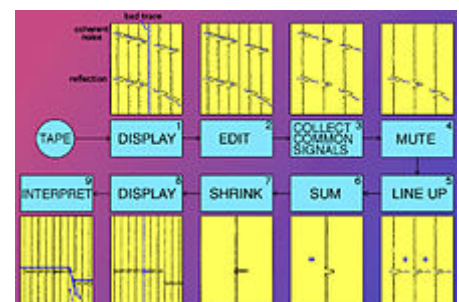
Polynomial signal processing is a type of non-linear signal processing, where polynomial systems may be interpreted as conceptually straight forward extensions of linear systems to the non-linear case.<sup>[8]</sup>

## Statistical

Statistical signal processing is an approach which treats signals as stochastic processes, utilizing their statistical properties to perform signal processing tasks.<sup>[9]</sup> Statistical techniques are widely used in signal processing applications. For example, one can model the probability distribution of noise incurred when photographing an image, and construct techniques based on this model to reduce the noise in the resulting image.

## Application fields

- Audio signal processing – for electrical signals representing sound, such as speech or music<sup>[10]</sup>
- Image processing – in digital cameras, computers and various imaging systems
- Video processing – for interpreting moving pictures
- Wireless communication – waveform generations, demodulation, filtering, equalization
- Control systems
- Array processing – for processing signals from arrays of sensors
- Process control – a variety of signals are used, including the industry standard 4-20 mA current loop
- Seismology
- Financial signal processing – analyzing financial data using signal processing techniques, especially for prediction purposes.
- Feature extraction, such as image understanding and speech recognition.
- Quality improvement, such as noise reduction, image enhancement, and echo cancellation.
- Source coding including audio compression, image compression, and video compression.



Seismic signal processing

- Genomic signal processing<sup>[11]</sup>

In communication systems, signal processing may occur at:

- OSI layer 1 in the seven layer OSI model, the physical layer (modulation, equalization, multiplexing, etc.);
- OSI layer 2, the data link layer (forward error correction);
- OSI layer 6, the presentation layer (source coding, including analog-to-digital conversion and data compression).

## Typical devices

---

- Filters – for example analog (passive or active) or digital (FIR, IIR, frequency domain or stochastic filters, etc.)
- Samplers and analog-to-digital converters for signal acquisition and reconstruction, which involves measuring a physical signal, storing or transferring it as digital signal, and possibly later rebuilding the original signal or an approximation thereof.
- Signal compressors
- Digital signal processors (DSPs)

## Mathematical methods applied

---

- Differential equations<sup>[12]</sup>
- Recurrence relation<sup>[13]</sup>
- Transform theory
- Time-frequency analysis – for processing non-stationary signals<sup>[14]</sup>
- Spectral estimation – for determining the spectral content (i.e., the distribution of power over frequency) of a time series<sup>[15]</sup>
- Statistical signal processing – analyzing and extracting information from signals and noise based on their stochastic properties
- Linear time-invariant system theory, and transform theory
- Polynomial signal processing – analysis of systems which relate input and output using polynomials
- System identification<sup>[6]</sup> and classification
- Calculus
- Complex analysis<sup>[16]</sup>
- Vector spaces and Linear algebra<sup>[17]</sup>
- Functional analysis<sup>[18]</sup>
- Probability and stochastic processes<sup>[9]</sup>
- Detection theory
- Estimation theory
- Optimization<sup>[19]</sup>
- Numerical methods
- Time series
- Data mining – for statistical analysis of relations between large quantities of variables (in this context representing many physical signals), to extract previously unknown interesting patterns

## See also

---

- [Algebraic signal processing](#)
- [Audio filter](#)
- [Bounded variation](#)
- [Digital image processing](#)
- [Dynamic range compression](#), [companding](#), [limiting](#), and [noise gating](#)
- [Fourier transform](#)
- [Information theory](#)
- [Least-squares spectral analysis](#)
- [Non-local means](#)
- [Reverberation](#)
- [Time series](#)

## References

---

1. Sengupta, Nandini; Sahidullah, Md; Saha, Goutam (August 2016). "Lung sound classification using cepstral-based statistical features". *Computers in Biology and Medicine*. **75** (1): 118–129. doi:10.1016/j.combiomed.2016.05.013 (<https://doi.org/10.1016%2Fj.combiomed.2016.05.013>). PMID 27286184 (<https://pubmed.ncbi.nlm.nih.gov/27286184>).
2. Alan V. Oppenheim and Ronald W. Schaffer (1989). *Discrete-Time Signal Processing*. Prentice Hall. p. 1. ISBN 0-13-216771-9.
3. Oppenheim, Alan V.; Schaffer, Ronald W. (1975). *Digital Signal Processing*. Prentice Hall. p. 5. ISBN 0-13-214635-5.
4. "A Mathematical Theory of Communication – CHM Revolution" (<https://www.computerhistory.org/revolution/digital-logic/12/269/1331>). *Computer History*. Retrieved 2019-05-13.
5. *Fifty Years of Signal Processing: The IEEE Signal Processing Society and its Technologies, 1948–1998*. The IEEE Signal Processing Society. 1998.
6. Billings, S. A. (2013). *Nonlinear System Identification: NARMAX Methods in the Time, Frequency, and Spatio-Temporal Domains*. Wiley. ISBN 978-1119943594.
7. Slawinska, J., Ourmazd, A., and Giannakis, D. (2018). "A New Approach to Signal Processing of Spatiotemporal Data". *2018 IEEE Statistical Signal Processing Workshop (SSP)*. IEEE Xplore. pp. 338–342. doi:10.1109/SSP.2018.8450704 (<https://doi.org/10.1109%2FSSP.2018.8450704>). ISBN 978-1-5386-1571-3. S2CID 52153144 (<https://api.semanticscholar.org/CorpusID:52153144>).
8. V. John Mathews; Giovanni L. Sicuranza (May 2000). *Polynomial Signal Processing*. Wiley. ISBN 978-0-471-03414-8.
9. Scharf, Louis L. (1991). *Statistical signal processing: detection, estimation, and time series analysis*. Boston: Addison–Wesley. ISBN 0-201-19038-9. OCLC 61160161 (<https://www.worldcat.org/oclc/61160161>).
10. Sarangi, Susanta; Sahidullah, Md; Saha, Goutam (September 2020). "Optimization of data-driven filterbank for automatic speaker verification". *Digital Signal Processing*. **104**: 102795. arXiv:2007.10729 (<https://arxiv.org/abs/2007.10729>). doi:10.1016/j.dsp.2020.102795 (<https://doi.org/10.1016%2Fj.dsp.2020.102795>). S2CID 220665533 (<https://api.semanticscholar.org/CorpusID:220665533>).
11. Anastassiou, D. (2001). "Genomic signal processing". *IEEE Signal Processing Magazine*. IEEE. **18** (4): 8–20. doi:10.1109/79.939833 (<https://doi.org/10.1109%2F79.939833>).

12. Patrick Gaydecki (2004). *Foundations of Digital Signal Processing: Theory, Algorithms and Hardware Design* (<https://books.google.com/books?id=6Qo7NvX3vz4C&q=%22differential+equation%22+OR+%22differential+equations%22&pg=PA40>). IET. pp. 40–. ISBN 978-0-85296-431-6.
13. Shlomo Engelberg (8 January 2008). *Digital Signal Processing: An Experimental Approach* (<https://books.google.com/books?id=z3CpcCHbtglC>). Springer Science & Business Media. ISBN 978-1-84800-119-0.
14. Boashash, Boualem, ed. (2003). *Time frequency signal analysis and processing a comprehensive reference* (1 ed.). Amsterdam: Elsevier. ISBN 0-08-044335-4.
15. Stoica, Petre; Moses, Randolph (2005). *Spectral Analysis of Signals* (<http://user.it.uu.se/%7Eps/SAS-new.pdf>) (PDF). NJ: Prentice Hall.
16. Peter J. Schreier; Louis L. Scharf (4 February 2010). *Statistical Signal Processing of Complex-Valued Data: The Theory of Improper and Noncircular Signals* (<https://books.google.com/books?id=HBaxLfDsAHoC&q=%22complex+analysis%22>). Cambridge University Press. ISBN 978-1-139-48762-7.
17. Max A. Little (13 August 2019). *Machine Learning for Signal Processing: Data Science, Algorithms, and Computational Statistics* (<https://books.google.com/books?id=ejGoDwAAQBAJ&q=%22vector+space%22>). OUP Oxford. ISBN 978-0-19-102431-3.
18. Steven B. Damelin; Willard Miller, Jr (2012). *The Mathematics of Signal Processing* (<https://books.google.com/books?id=MtPLYXQ9d9MC&q=%22functional+analysis%22>). Cambridge University Press. ISBN 978-1-107-01322-3.
19. Daniel P. Palomar; Yonina C. Eldar (2010). *Convex Optimization in Signal Processing and Communications* (<https://books.google.com/books?id=UOpnvPJ151gC>). Cambridge University Press. ISBN 978-0-521-76222-9.

## Further reading

---

- P Stoica, R Moses (2005). *Spectral Analysis of Signals* (<http://user.it.uu.se/%7Eps/SAS-new.pdf>) (PDF). NJ: Prentice Hall.
- Kay, Steven M. (1993). *Fundamentals of Statistical Signal Processing*. Upper Saddle River, New Jersey: Prentice Hall. ISBN 0-13-345711-7. OCLC 26504848 (<https://www.worldcat.org/oclc/26504848>).
- Papoulis, Athanasios (1991). *Probability, Random Variables, and Stochastic Processes* (third ed.). McGraw-Hill. ISBN 0-07-100870-5.
- Kainam Thomas Wong [1] (<http://www.eie.polyu.edu.hk/~enktwong/>): Statistical Signal Processing lecture notes at the University of Waterloo, Canada.
- Ali H. Sayed, Adaptive Filters, Wiley, NJ, 2008, ISBN 978-0-470-25388-5.
- Thomas Kailath, Ali H. Sayed, and Babak Hassibi, Linear Estimation, Prentice-Hall, NJ, 2000, ISBN 978-0-13-022464-4.

## External links

---

- Signal Processing for Communications (<http://www.sp4comm.org/>) – free online textbook by Paolo Prandoni and Martin Vetterli (2008)
- Scientists and Engineers Guide to Digital Signal Processing (<http://www.dspguide.com>) – free online textbook by Stephen Smith

**This page was last edited on 5 June 2022, at 18:24 (UTC).**

Text is available under the Creative Commons Attribution-ShareAlike License 3.0; additional terms may apply. By using this site, you agree to the Terms of Use and Privacy Policy. Wikipedia® is a registered trademark of the Wikimedia Foundation, Inc., a non-profit organization.