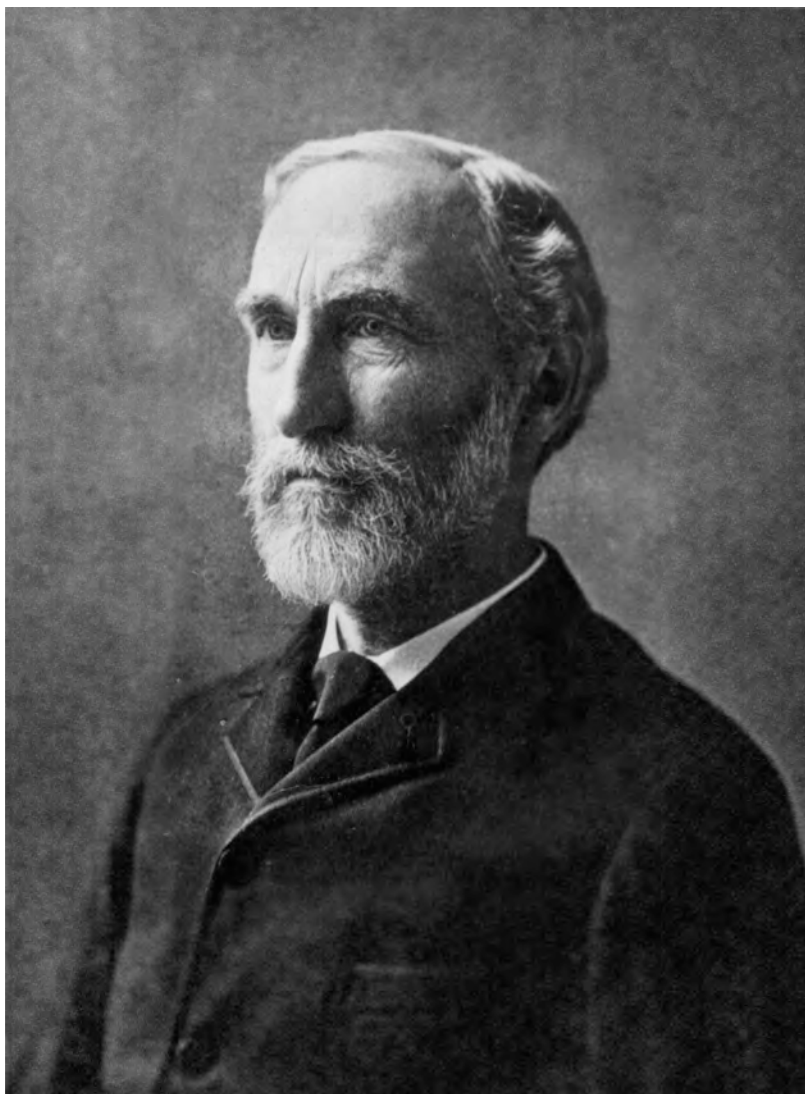


**84th Josiah Willard Gibbs Lecture**

*Wednesday, January 4, 2012*

*8:30 PM*



JOSIAH WILLARD GIBBS 1839–1903

*Photograph by Pictorial Mathematics  
Scripta Mathematica  
Yeshiva College, New York, 1942*



*American Mathematical Society*

## **Josiah Willard Gibbs Lecture**

Wednesday, January 4, 2012

8:30 PM

Ballrooms A-B

3rd Floor

Hynes Convention Center

Boston, MA

A 250-year argument: Belief, behavior, and the bootstrap

Bradley Efron

Stanford University

*To commemorate the name of Professor Gibbs, the American Mathematical Society established an honorary lectureship in 1923 to be known as the Josiah Willard Gibbs Lectureship. The lectures are of a semipopular nature and are given by invitation. They are usually devoted to mathematics or its applications. It is hoped that these lectures will enable the public and the academic community to become aware of the contribution that mathematics is making to present-day thinking and to modern civilization.*

# Abstract

The year 2013 marks the 250th anniversary of Bayes rule, one of the two fundamental inferential principles of mathematical statistics. The rule has been influential over the entire period, and controversial over most of it. Its reliance on prior beliefs has been challenged by frequentism, which focuses instead on the behavior of specific estimates and tests under repeated use. Twentieth Century statistics was overwhelmingly behavioristic, especially in applications, but the Twenty-First Century has seen a resurgence of Bayesianism. I will use some simple examples to show what's at stake in the argument. The bootstrap, a computer-intensive inference machine, helps connect Bayesian and frequentist practice. No advanced statistical background is required.



# Bradley Efron

Bradley Efron is the Max H. Stein Professor of Statistics and Biostatistics at Stanford University's School of Humanities and Sciences and the Department of Health Research and Policy with the School of Medicine. He completed his undergraduate work in mathematics at the California Institute of Technology, and earned his doctorate in statistics from Stanford in 1964, joining the Stanford faculty that same year. He was Associate Dean for the School of Humanities and Sciences from 1987 to 1990, served a term as Chair of the Faculty Senate as well as three terms as Chair of the Department of Statistics, and continues as Chairman of the Mathematical and Computational Sciences Program. He has served as president of the American Statistical Association and of the Institute of Mathematical Statistics. He is a past editor of the *Journal of the American Statistical Association* and is presently the founding editor of the *Annals of Applied Statistics*.

Among the numerous honors that Efron has received are Fellowships of the American Academy of Arts and Sciences, the American Statistical Association, the Institute of Mathematical Statistics, the Royal Statistical Society, the International Statistical Institute and the MacArthur Fellows Program of the John D. and Catherine T. MacArthur Foundation. He is a member of the U.S. National Academy of Sciences, a recipient of the Ford Prize of the Mathematical Association of America and of both the Wilks Medal and the Noether Prize of the American Statistical Association. Efron was awarded the 1998 Parzen Prize for Statistical Innovation by Texas A&M University, and the first-ever Rao Prize for outstanding research in statistics by Pennsylvania State University in 2003. He received the 2005 National Medal of Science “for his contributions to theoretical and applied statistics, especially the bootstrap sampling technique; for his extraordinary geometric insight into nonlinear statistical problems; and for applications in medicine, physics and astronomy.”

## Gibbs Lectures

1. February 1924, New York City; Professor Michael I. Pupin, Columbia University; *Coordination*, Scribner's Magazine, v. 76, no. 1, pp. 3–10 (1925).
2. December 1924, Washington, D.C.; Dr. Robert Henderson, Vice President, Equitable Life Assurance Society of the U.S.; *Life insurance as a social science and as a mathematical problem*, Bulletin of the American Mathematical Society, v. 31, nos. 5–6, pp. 227–252 (1925).
3. December 1925, Kansas City, Missouri; Professor James Pierpont, Yale University; *Some modern views of space*, Bulletin of the American Mathematical Society, v. 32, no. 3, pp. 225–258 (1926).
4. December 1926, Philadelphia, Pennsylvania; Professor H. B. Williams, Columbia University; *Mathematics and the biological sciences*, Bulletin of the American Mathematical Society, v. 33, no. 3, pp. 273–293 (1927).
5. December 1927, Nashville, Tennessee; Professor E. W. Brown, Yale University; *Resonance in the solar system*, Bulletin of the American Mathematical Society, v. 34, no. 3, pp. 265–289 (1928).
6. December 1928, New York City; Professor G. H. Hardy, Trinity College (England); *An introduction to the theory of numbers*, Bulletin of the American Mathematical Society, v. 35, no. 6, pp. 778–818 (1929).
7. December 1929, Des Moines, Iowa; Professor Irving Fisher, Yale University; *The applications of mathematics to the social sciences*, Bulletin of the American Mathematical Society, v. 36, no. 4, pp. 225–243 (1930).
8. December 1930, Cleveland, Ohio; Professor E. B. Wilson, Harvard School of Public Health; *Reminiscences of Gibbs by a student and colleague*, Bulletin of the American Mathematical Society, v. 37, no. 6, pp. 401–416 (1931).
9. December 1931, New Orleans, Louisiana; Professor P. W. Bridgman, Harvard University; *Statistical mechanics and the second law of thermodynamics*, Bulletin of the American Mathematical Society, v. 38, no. 4, pp. 225–245 (1932).
10. December 1932, Atlantic City, New Jersey; Professor R. C. Tolman, California Institute of Technology; *Thermodynamics and relativity*, Bulletin of the American Mathematical Society, v. 39, no. 2, pp. 49–74 (1933).
11. December 1934, Pittsburgh, Pennsylvania; Professor Albert Einstein, Institute for Advanced Study; *An elementary proof of the theorem concerning the equivalence of mass and energy*, Bulletin of the American Mathematical Society, v. 41, no. 4, pp. 223–230 (1935).
12. January 1935, St. Louis, Missouri; Dr. Vannevar Bush, Vice President, Massachusetts Institute of Technology; *Mechanical analysis*, Bulletin of the American Mathematical Society, v. 42, no. 10, pp. 649–670 (1936).
13. October 1936, New York City; Professor H. N. Russell, Princeton University; *Model stars*, Bulletin of the American Mathematical Society, v. 43, no. 2, pp. 49–77 (1937).
14. December 1937, Indianapolis, Indiana; Professor C. A. Kraus, Brown University; *The present status of the theory of electrolytes*, Bulletin of the American Mathematical Society, v. 44, no. 6, pp. 361–383 (1938).
15. December 1939, Columbus, Ohio; Professor Theodore von Kármán, California Institute of Technology; *The engineer grapples with nonlinear problems*, Bulletin of the American Mathematical Society, v. 46, no. 8, pp. 615–683 (1940).
16. September 1941, Chicago, Illinois; Professor Sewall Wright, University of Chicago; *Statistical genetics and evolution*, Bulletin of the American Mathematical Society, v. 48, no. 4, pp. 223–246 (1942).
17. November 1943, Chicago, Illinois; Professor Harry Bateman, California Institute of Technology; *The control of elastic fluid*, Bulletin of the American Mathematical Society, v. 51, no. 9, pp. 601–646 (1945).

18. November 1944, Chicago, Illinois; Professor John von Neumann, Institute for Advanced Study; *The ergodic theorem and statistical mechanics*.
19. November 1945, Chicago, Illinois; Professor J. C. Slater, Massachusetts Institute of Technology; *Physics and the wave equation*, Bulletin of the American Mathematical Society, v. 52, no. 5, part 1, pp. 392–400 (1946).
20. November 1946, Swarthmore, Pennsylvania; Professor Subrahmanyan Chandrasekhar, University of Chicago; *The transfer of radiation in stellar atmosphere*, Bulletin of the American Mathematical Society, v. 53, no. 7, pp. 641–711 (1947).
21. December 1947, Athens, Georgia; Professor P. M. Morse, Massachusetts Institute of Technology; *Mathematical problems in operations research*, Bulletin of the American Mathematical Society, v. 54, no. 7, pp. 602–621 (1948).
22. December 1948, Columbus, Ohio; Professor Hermann Weyl, Institute for Advanced Study; *Ramification, old and new, of the eigenvalue problem*, Bulletin of the American Mathematical Society, v. 56, no. 2, pp. 115–139 (1950).
23. December 1949, New York City; Professor Norbert Wiener, Massachusetts Institute of Technology; *Problems of sensory prosthesis*, Bulletin of the American Mathematical Society, v. 57, no. 1, pp. 27–35 (1951).
24. December 1950, Gainesville, Florida; Professor G. E. Uhlenbeck, University of Michigan; *Some basic problems of statistical mechanics*.
25. December 1951, Providence, Rhode Island; Professor Kurt Gödel, Institute for Advanced Study; *Some basic theorems on the foundations of mathematics and their philosophical implications*. First published in his *Collected Works*, v. III, Oxford University Press, pp. 304–323 (1995). Published title omits the word “philosophical”.
26. December 1952, St. Louis, Missouri; Professor Marston Morse, Institute for Advanced Study; *Topology and geometrical analysis*.
27. December 1953, Baltimore, Maryland; Professor Wassily Leontief, Harvard University; *Mathematics in economics*, Bulletin of the American Mathematical Society, v. 60, no. 3, pp. 215–233 (1954).
28. December 1954, Pittsburgh, Pennsylvania; Professor Kurt O. Friedrichs, Institute of Mathematical Sciences, New York University; *Asymptotic phenomena in mathematical physics*, Bulletin of the American Mathematical Society, v. 61, no. 6, pp. 485–504 (1955).
29. December 1955, Houston, Texas; Professor Joseph E. Meyer, University of Chicago; *The structure of simple fields*, Bulletin of the American Mathematical Society, v. 62, no. 4, pp. 332–346 (1956).
30. December 1956, Rochester, New York; Professor Marshall H. Stone, University of Chicago; *Mathematics and the future of science*, Bulletin of the American Mathematical Society, v. 63, no. 2, pp. 61–76 (1957).
31. January 1958, Cincinnati, Ohio; Professor H. J. Muller, Department of Zoology, Indiana University; *Evolution by mutation*, Bulletin of the American Mathematical Society, v. 64, no. 4, pp. 137–160 (1958).
32. January 1959, Philadelphia, Pennsylvania; Professor J. M. Burgers, University of Maryland; *On the emergence of patterns of order*, Bulletin of the American Mathematical Society, v. 69, no. 1, pp. 1–25 (1963).
33. January 1960, Chicago, Illinois; Professor Julian Schwinger, Harvard University; *Quantum field theory*.
34. January 1961, Washington, D.C.; Professor J. J. Stoker, Institute of Mathematical Sciences, New York University; *Some nonlinear problems in elasticity*, Bulletin of the American Mathematical Society, v. 68, no. 4, pp. 239–278 (1962). Published under the title *Some observations on continuum mechanics with emphasis on elasticity*.
35. January 1962, Cincinnati, Ohio; Professor C. N. Yang, Institute for Advanced Study; *Symmetry principles in modern physics*.
36. January 1963, Berkeley, California; Professor Claude E. Shannon, Massachusetts Institute of Technology; *Information theory*.
37. January 1964, Miami, Florida; Professor Lars Onsager, Yale University; *Mathematical problems of cooperative phenomena*.

38. January 1965, Denver, Colorado; Professor D. H. Lehmer, University of California, Berkeley; *Mechanical mathematics*, Bulletin of the American Mathematical Society, v. 72, no. 5, pp. 739–750 (1966).
39. January 1966, Chicago, Illinois; Professor Martin Schwarzschild, Princeton University; *Stellar evolution*.
40. January 1967, Houston, Texas; Professor Mark Kac, Rockefeller University; *Some mathematical problems in the theory of phase transitions*.
41. January 1968, San Francisco, California; Professor Eugene P. Wigner, Princeton University; *Problems of symmetry in old and new physics*, Bulletin of the American Mathematical Society, v. 74, no. 5, pp. 793–815 (1968).
42. January 1969, New Orleans, Louisiana; Professor Raymond L. Wilder, University of Michigan; *Trends and social implications of research*, Bulletin of the American Mathematical Society, v. 75, no. 5, pp. 891–906 (1969).
43. January 1970, San Antonio, Texas; Professor Walter H. Munk, Institute of Geophysics and Planetary Physics and the Scripps Institution of Oceanography, University of California, San Diego; *Tides and time*.
44. January 1971, Atlantic City, New Jersey; Professor Eberhard F. F. Hopf, Indiana University; *Ergodic theory and the geodesic flow on surfaces of constant negative curvature*, Bulletin of the American Mathematical Society, v. 77, no. 6, pp. 863–877 (1971).
45. January 1972, Las Vegas, Nevada; Professor Freeman J. Dyson, Institute for Advanced Study; *Missed opportunities*, Bulletin of the American Mathematical Society, v. 78, no. 5, pp. 635–652 (1972).
46. January 1973, Dallas, Texas; Professor Jürgen Moser, Courant Institute of Mathematical Sciences, New York University; *The stability concept in dynamical systems*.
47. January 1974, San Francisco, California; Professor Paul A. Samuelson, Massachusetts Institute of Technology; *Economics and mathematical analysis*.
48. January 1975, Washington, D.C.; Professor Fritz John, Courant Institute of Mathematical Sciences, New York University; *A priori estimates, geometric effects, and asymptotic behavior*, Bulletin of the American Mathematical Society, v. 81, no. 6, pp. 1013–1023 (1975).
49. January 1976, San Antonio, Texas; Professor Arthur S. Wightman, Princeton University; *Nonlinear functional analysis and some of its applications in quantum field theory*.
50. January 1977, St. Louis, Missouri; Professor Joseph B. Keller, Courant Institute of Mathematical Sciences, New York University; *Rays, waves, and asymptotics*, Bulletin of the American Mathematical Society, v. 84, no. 5, pp. 727–750 (1978).
51. January 1978, Atlanta, Georgia; Professor Donald E. Knuth, Stanford University; *Mathematical typography*, Bulletin of the American Mathematical Society (N.S.), v. 1, no. 2, pp. 337–372 (1979).
52. January 1979, Biloxi, Mississippi; Professor Martin Kruskal, Princeton University; *“What are solitons and inverse scattering anyway, and why should I care?”*
53. January 1980, San Antonio, Texas; Professor Kenneth Wilson, Cornell University; *The statistical continuum limit*.
54. January 1981, San Francisco, California; Professor Cathleen S. Morawetz, Courant Institute of Mathematical Sciences, New York University; *The mathematical approach to the sound barrier*, Bulletin of the American Mathematical Society (N.S.), v. 6, no. 2, pp. 127–145 (1982). Published under the title *The mathematical approach to the sonic barrier*.
55. January 1982, Cincinnati, Ohio; Professor Elliott W. Montroll, Institute for Physical Science and Technology, University of Maryland, College Park, Maryland; *The dynamics and evolution of some sociotechnical systems*, Bulletin of the American Mathematical Society (N.S.), v. 16, no. 1, pp. 1–46 (1987).
56. January 1983, Denver, Colorado; Professor Samuel Karlin, Stanford University, Stanford, California; *Mathematical models and controversies of evolutionary theory*, Bulletin of the American Mathematical Society (N.S.), v. 10, no. 2, pp. 221–273 (1984). Published under the title *Mathematical models, problems, and controversies of evolutionary theory*.

57. January 1984, Louisville, Kentucky; Professor Herbert A. Simon, Carnegie-Mellon University, Pittsburgh, Pennsylvania; *Computer modeling of the processes of scientific and mathematical discovery*, Bulletin of the American Mathematical Society (N.S.), v. 11, no. 2, pp. 247–262 (1984). Published under the title *Computer modeling of scientific and mathematical discovery processes*.
58. January 1985, Anaheim, California; Professor Michael O. Rabin, Harvard University, Cambridge, Massachusetts and Hebrew University, Jerusalem, Israel; *Randomization in mathematics and computer science*.
59. January 1986, New Orleans, Louisiana; Professor L. E. Scriven, University of Minnesota; *The third leg: Mathematics and computation in applicable science and high technology*.
60. January 1987, San Antonio, Texas; Professor Thomas C. Spencer, Courant Institute of Mathematical Sciences, New York University; *Schrödinger operators and dynamical systems*.
61. January 1988, Atlanta, Georgia; Professor David P. Ruelle, Institut des Hautes Études Scientifiques, Paris, France; *How natural is our mathematics? The example of equilibrium statistical mechanics*, Bulletin of the American Mathematical Society (N.S.), v. 19, no. 2, pp. 259–268 (1988). Published under the title *Is our mathematics natural? The case of equilibrium statistical mechanics*.
62. January 1989, Phoenix, Arizona; Professor Elliott H. Lieb, Princeton University, Princeton, New Jersey; *The stability of matter: from atoms to stars*, Bulletin of the American Mathematical Society (N.S.), v. 22, no. 1, pp. 1–49 (1990).
63. January 1990, Louisville, Kentucky; Professor George B. Dantzig, Stanford University, Stanford, California; *The wide wide world of pure mathematics that goes by other names*.
64. January 1991, San Francisco, California; Sir Michael Atiyah, FRS, Trinity College, Cambridge, England; *Physics and the mysteries of space*; Selected Lectures, AMS videotape.
65. January 1992, Baltimore, Maryland; Professor Michael E. Fisher, Institute for Physical Sciences and Technology, University of Maryland, College Park, Maryland; *Approaching the limit: Mathematics and myth in statistical physics*.
66. January 1993, San Antonio, Texas; Professor Charles S. Peskin, Courant Institute of Mathematical Sciences, New York University; *Fluid dynamics and fiber architecture of the heart and its valves*.
67. January 1994, Cincinnati, Ohio; Professor Robert M. May, Oxford University; *Necessity and chance: Deterministic chaos in ecology and evolution*, Bulletin of the American Mathematical Society (N.S.), v. 32, no. 3, pp. 291–308 (1995).
68. January 1995, San Francisco, California; Professor Andrew J. Majda, Princeton University; *Turbulence, turbulent diffusion, and modern applied mathematics*.
69. January 1996, Orlando, Florida; Professor Steven Weinberg, University of Texas, Austin; *Is field theory the answer? Is string theory the answer? What was the question?*
70. January 1997, San Diego, California; Professor Persi Diaconis, Department of Mathematics, Harvard University; *Patterns in eigenvalues*, Bulletin of the American Mathematical Society (N.S.), v. 40, no. 2, pp. 155–178 (2003).
71. January 1998, Baltimore, Maryland; Professor Edward Witten, School of Natural Sciences, Institute for Advanced Study; *M-Theory*, Notices of the American Mathematical Society, v. 45, no. 9, pp. 1124–1129 (1999). Published under the title *Magic, mystery, and matrix*.
72. January 1999, San Antonio, Texas; Professor Nancy J. Kopell, Boston University; *We got rhythm: Dynamical systems of the nervous system*, Notices of the American Mathematical Society, v. 47 no. 1, pp. 6–16 (2000).
73. January 2000, Washington, DC; Professor Roger Penrose, Mathematical Institute, Oxford University; *Physics, computability, and mentality*.
74. January 2001, New Orleans, Louisiana; Professor Ronald L. Graham, University of California, San Diego; *The Steiner problem*.
75. January 2002, San Diego, California; Professor Michael V. Berry, Physics Department, Bristol University, UK; *Making light of mathematics*, Bulletin of the American Mathematical Society (N.S.), v. 40, no. 2, pp. 229–237 (2003).

76. January 2003, Baltimore, Maryland; Professor David B. Mumford, Division of Applied Mathematics, Brown University, Providence, RI; *The shape of objects in two and three dimensions: Mathematics meets computer vision.*
77. January 2004, Phoenix, Arizona; Professor Eric S. Lander, Professor of Biology, Massachusetts Institute of Technology, Cambridge, Massachusetts; *Biology as information.*
78. January 2005, Atlanta, Georgia; Professor Ingrid Daubechies, Department of Mathematics and Program in Applied and Computational Mathematics, Princeton University, Princeton, New Jersey; *The interplay between analysis and algorithms.*
79. January 2006, San Antonio, Texas; Professor Michael A. Savageau, Department of Biomedical Engineering and Microbiology Graduate Group, University of California, Davis, California; *Function, design, and evolution of gene circuitry.*
80. January 2007, New Orleans, Louisiana; Professor Peter D. Lax, Courant Institute of Mathematical Sciences, New York University, New York, New York; *Mathematics and physics.*
81. January 2008, San Diego, California; Professor Avi Wigderson, Institute for Advanced Study, Princeton, New Jersey; *Randomness—A computational complexity view.*
82. January 2009, Washington, DC; Professor Percy Deift, Courant Institute of Mathematical Sciences, New York University, New York; *Integrable systems: A modern view.*
83. January 2010, San Francisco, CA; Professor Peter Shor, Massachusetts Institute of Technology; *Quantum channels and their capacities.*
84. January 2011, New Orleans, LA; Professor George Papanicolaou, Stanford University; *Mathematical problems in systemic risk.*
85. January 2012, Boston, MA; Professor Bradley Efron, Stanford University; *A 250-year argument: Belief, behavior, and the bootstrap.*