# **DAVID WOLPERT**

Santa Fe Institute, 1399 Hyde Park Rd., Santa Fe, NM
Arizona State University, Tempe, Arizona
Complexity Science Hub, Vienna
International Center for Theoretical Physics, Trieste, Italy
Albert Einstein Institute for Advanced Study in the Life Sciences
<a href="http://davidwolpert.weebly.com">http://davidwolpert.weebly.com</a>

## **RESEARCH FOCUS:**

Stochastic thermodynamics of computation Computational models of social system dynamics; Economies of Als Foundations of Machine Learning; Noisy deductive reasoning

## **WORK EXPERIENCE:**

March 2022 to present	International Center for Theoretical Physics, Trieste, Research Staff Associate
February 2019 to present	Complexity Science Hub, Vienna, External professor
February 2015 to present	Arizona State University, Center for Bio-social complex systems, Adjunct Professor
September 2013 to present	Santa Fe Institute, Santa Fe, Professor.
February 2015 to June, 2018	MIT Astronautics and Aeronautics Dept., Visiting Professor
November 2011 to September 2013	Los Alamos National Laboratory, CCS-3. Scientist 5. Perform fundamental and applied research and provide leadership in game theory, machine learning, information theory, optimization, and the foundations of physics.
July 2011 to September 2013	Santa Fe Institute, Santa Fe, External Faculty.
October 2010 to September 2011	<u>Center for Nonlinear Studies, Los Alamos</u> . <i>Stanislaw M. Ulam Distinguished Scholar</i> . (See cnls.lanl.gov/external/ulam.php)

2006 to present (extended visits)	Max Planck Institute, Visiting scholar
Fall, 2007	<u>Tsinghua University</u> , Beijing, <i>Visiting Professor</i> . Taught intensive short course
June 2005 to 2007	Stanford University Aeronautics and Astronautics Dept. Consulting Professor. Supervised students in several departments doing research on adaptive distributed control and bounded rational game theory.
May 1997 to November 2011	NASA Ames Research Center. Senior Computer Scientist. Supervised a group conducting research on collective intelligence, combinatorial optimization, and machine learning.
April 1996 to May 1997	IBM Almaden Research Center. Datamining Solutions, Research Manager. Supervised and conducted product-driven and academic research on machine learning and statistics.
July 1995 to March 1996	TXN Inc. Director of Research. Conducted product-driven and academic research on machine learning. In particular developed a run-time fraud system for telecommunications networks.
November 1991 to March 1996	Santa Fe Institute. Postdoc. Conducted research on supervised learning, Bayesian statistics, and the thermodynamics of computation.
January 1994 to June 1995	Pediatric Aids Foundation and NIH Correlates of Human Immuno-Deficiency Program. Research Associate. With Bette Korber of Los Alamos conducted statistical analysis and research on HIV-related epidemiological datasets.
May 1993 to June 1995	TXN Inc. Consultant. Conducted product-driven research on machine learning.
March 1989	<u>Theoretical Division</u> and <u>Center For Nonlinear Studies</u> , Los Alamos National Laboratory. <u>Postdoc</u> ( <u>Director's Fellow</u> ). Conducted research on machine

#### **EDUCATION:**

Ph.D., UNIVERSITY OF CALIFORNIA, SANTA BARBARA, Physics, 1989. Dissertation: Neural networks and generalization theory.

SANTA FE SUMMER SCHOOL ON COMPLEX SYSTEMS, 1988.

M.A., UNIVERSITY OF CALIFORNIA, SANTA BARBARA, Physics, 1987.

B.A., PRINCETON UNIVERSITY, Physics, 1984 (Cum Laude).

Thesis: Filamentary structure of large scale galaxy distributions.

## **GRANTS** (within last ten years, in reverse chronological order):

NSF EAGER, CCF-2221345, Stochastic Thermodynamics of Distributed Computation; \$299,888, Lead PI

NSF FET, 2145170, The Future of Thermodynamics of Computation; \$49,991, Lead PI

FQXi-RFP-IPW-1912; The Role of Constraints in the Thermodynamics of Intelligence; \$118,100, Lead PI

NSF, 2145170, Thermodynamics and Computation: Towards a New Synthesis; \$45,000, Lead PI

NSF, PHY-1741021, Thermodynamics of Computation in Chemical and Biological Systems; \$49,976, co-PI

NSF IBSS, 1620462; Information Networks and the Evolution of Social Organizations; \$770,000, Lead PI

NSF, CHE-1648973; INSPIRE: Tradeoffs in the Thermodynamics of Computation: A New Paradigm for Biological Information-Processing; \$999,947, Lead PI

FQXi, SVCF: 2016-160137 (5561)/ FQXi-RFP-1622; Observers as self-maintaining non-equilibrium systems; \$128,319, Lead PI

ARO, W911-NF-15-1-0127; Event-driven game theory for predicting dynamics of social systems, \$294,535, Lead PI

AFOSR, FA9550-15-1-0038A; Unified and Algorithmic Framework for Managing Multiple Information Sources of Multi- Physics Systems, \$4,298,194, **co-Pl** 

NASA, NNX14ZI11G; Event-driven Game Theory for Aviation Safety, \$900,000, Lead PI

NASA, 60058457-101700-C; Modeling of Airline Behavior Using Strategic, Agent-Based Approaches, \$281,948, Lead PI

Templeton World Charity Foundation, TWCF0079/ AB47; *Information Theory, Ecosystems, and Schrodinger's Paradox*, \$588,061, **Lead PI** 

FQXi, SVCF: 2013-111422 (4661)/ FQXi-RFP-1349; A Semantic Information-Theory Model of Reality, \$50,000, Lead PI

### **REFERED PUBLICATIONS:**

## **Physics of Computation/**

Wolpert, D.H., "Combining lower bounds on entropy production in complex systems with multiple interacting components", *Frontiers in Entropy Across the Disciplines*, Freeden, W., and Nashed, M. (Eds), in press.

Wolpert, D.H., "Strengthened second law for multi-dimensional systems coupled to multiple thermodynamic reservoirs", *Philosophical Transactions A*, 2022.

Kolchinsky, A., Wolpert, D.H., "State dependence of integrated, instantaneous, and fluctuating entropy production in quantum and classical processes", *Physical Review E*, 2021

Kolchinsky, A., Wolpert, D.H., "Entropy production given constraints on the energy functions", *Physical Review E*, 2021

Kolchinsky, A., Wolpert, D.H., "Work, entropy production, and thermodynamics of information under protocol constraints" *Physical Review X*, 2021

Korbel, J., and Wolpert, D.H., "Stochastic thermodynamics and fluctuation theorems for non-linear systems", New Journal of Physics, February, 2021

Wolpert, D.H. "Minimal entropy production rate of interacting systems", New Journal of Physics, October, 2020

Wolpert, D.H., "Uncertainty relations and fluctuation theorems for Bayes nets", *Physical Review Letters*, **125**, 200602, 2020

Kolchinsky, A., and Wolpert, D.H., "Thermodynamic costs of Turing machines", *Physical Review Research*, **2**, 033312, 2020

Wolpert, D.H., and Kolchinsky, A., "The thermodynamics of computing with circuits", New Journal of Physics, March, 2020

Wolpert, D.H., "The stochastic thermodynamics of computation", <u>Invited article</u>, *Journal of Physics A: Mathematical and General*, **52**, 193001, 2019.

Wolpert, D.H., Kolchinsky, A., and Owen, J., "A space/time tradeoff for implementing a function with master equation dynamics", *Nature Communications*, **10**, 1727, 2019.

Owen, J., Kolchinsky, A., and Wolpert, D.H., "Number of hidden states needed to physically implement a given conditional distribution", *New Journal of Physics*, December, 2018.

Kolchinsky, A., and Wolpert, D.H., "Semantic information, agency and nonequilibrium statistical physics", *Interface Focus*, doi.org/10.1098/rsfs.2018.0041, 2018.

Grochow J., and Wolpert, D.H., "Beyond number of bit erasures: New complexity questions raised by recently discovered thermodynamic costs of computation", *SIGACT News* June, 33-56, 2018.

Kolchinsky, A., and Wolpert, D.H., "Dependence of dissipation on the initial distribution over states" *Journal of Statistical Mechanics: Theory and Experiment*, 083202, 2017

Kempes, C., Wolpert, D.H., Cohen, Z., Perez-Mercador, J. "Energetic efficiency of computations made across the diversity of life", in *Phil. Trans. A, Theme issue on Re-Conceptualizing the Origin of Life from a Physical Science Perspective*, S. Walker (Ed.), 2017.

Wolpert, D.H., "The free energy requirements of biological organisms; implications for evolution", *Entropy 18*(4), 138, 2016 (special issue on Information and Entropy in Biological Systems, J. Baez (Ed.).

(Erratum at *Entropy*, 18(6), 219, 2016; doi: 10.3390/e18060219)

Wolpert, D.H., "Information Width: a way for the second law to increase complexity", in *The Self-Organizing Universe: Cosmology, Biology, and the Rise of Complexity*, C. Lineweaver, P. Davies, and M. Ruse (Ed.'s), Cambridge University Press, 2013.

Wolpert, D.H. and Benford, G., "The Lesson of Newcomb's Paradox", Synthese, 2011.

Wolpert, D.H., "Inference concerning physical systems", Proc. of CiE 2010, Fernando Ferreira, Benedikt Lowe, Elvira Mayordomo, Luis Mendes Gomes (Eds.), Springer, 2010

Wolpert, D.H., "Physical limits of inference", Physica D, 237 (2008) 1257-1281.

See also Binder, P., "Theories of almost everything", Nature, 455 (2008), 884-885

Wolpert, D.H., "Computational Capabilities of Physical Systems", *Physical Review E*, Vol. 65, 016128, Dec. 20, 2001.

Wolpert, D.H., "The Second Law, Computation, and the Temporal (A)symmetry of Memory", in *Advances in the Physics of Computation*, Ed. D. Matzke, IEEE press, 1993.

Wolpert, D.H. "Memory Systems, Computation, and The Second Law of Thermodynamics", *International Journal of Theoretical Physics*, **31**, 743-785, 1992.

Wolpert, D.H., "Reversible Computing and Physical Law", *PHYSICS TODAY*, 98-99 (March 1992).

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### **Human Behavior and Control of Collective Systems/**

Kahneman, D.; Krakauer, D.; Sibony, O.; Sunstein, C and Wolpert, D.H. "An exchange of letters on the role of noise in collective intelligence", *Collective Computation*, 2022

Bird, D., Kohler, T., and Wolpert, D.H. "Social Scale and Collective Computation: Does Information Processing Limit Rate of Growth in Scale?", *Journal of Social Computing*, 2022

Bird, D., Kohler, T., and Wolpert, D.H., Editors of special issue of *Journal of Social Computing* on "The Evolution of Collective Computation within (Pre)historic Societies", 2022

Wolpert, D.H., "The (NOT) shortcomings of modern game theory", in *Proceedings of the Santa Fe Institute's 2019 Fall symposium*", B. Arthur et al., (Ed.), SFI Press, 2020

Shin, J., Price, M., Wolpert, D.H., H. Shimao, B. Tracey, and T. Kohler, "Scale and Information-Processing Thresholds in Holocene Social Evolution", *Nature Communications*, May, 2020

Wolpert, D.H., and Grana, J., "How Much Would You Pay to Change a Game before Playing It?", *Entropy*, number **21**, 2019.

Grana, J., Bono., J., and Wolpert, D.H. "Reasoning About 'When' Instead of 'What': Collusive Equilibria with Stochastic Timing in Repeated Oligopoly", *Berkeley Electronic Journal of Theoretical Economics*, 20180038, 2019.

K. Mendal, Y. Chen, J. Grana, J. Bono, B. Tracey, M. Kochenderfer, D.H. Wolpert, "Deep Reinforcement Learning for Event-Driven Multi-Agent Decision Processes", *Transactions on Intelligent Transportation Systems*, Volume 20, Issue 4, April 2019.

J. Jost, N. Bertschinger, E. Olbrich, and D. Wolpert, "Information geometry and game theory", in *Information Geometry and Its Applications IV*, N. Ay, P. Gibilisco, F. Matus (eds.), Springer Proceedings in Mathematics & Statistics, 2018.

Y. Kim, M. J. Kochenderfer, J. Grana, J. Bono, and D. Wolpert, "Optimal Lost-Link Policies for Unmanned Aircraft," in *IEEE/AIAA Digital Avionics Systems Conference*, 2015.

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Bono, J., Wolpert, D., Xie, D. and Grana J., "Decision-Theoretic Prediction and Policy Design of GDP Slot Auctions", *American Institute of Aeronautics and Astronautics* 2014-2163, June 2014.

Backhaus, S., Bent, R., Bono, J., Lee, R, Tracey, B., Wolpert, D.h., Xie, D. and Yildiz, Y. "Cyber-Physical Security: A Game Theory Model of Humans Interacting over Control Systems", *IEEE Transactions on Smart Grid*, 2014.

Bono, J.W., and Wolpert, D.H., "Game Mining: How to Make Money from those about to Play a

Game", in *Entangled Political Economy*, Horwitz, Steven and Roger Koppl (Eds.), *Advances in Austrian Economics*, Vol. 18, Bingley, UK: JAI Press, 2014

Bono, J.W., Alonso, J., Bonnefoy, P., Fan, A. McConnachie, B., Tracey B., Wolpert, D., Xie, D.P., "Application of game theoretic models to evaluate airline equipage dynamics of Nextgen technologies", 2013 Aviation, Technology, Integration and Operations Conference.

Wolpert, D.H., and Bono, J.W., "A theory of unstructured bargaining using distribution-valued solution concepts", *Journal of Artificial Intelligence Research*, **46**, 2013.

Yan, G., Lee, R., Kent, A, Wolpert, D., "Towards a Bayesian network game framework for evaluating DDoS attacks and defense", Proceedings of *2012 ACM Conference on Computer and Communications Security*, 2013.

Schlicht E., Lee R., Tracey B., Wolpert, D., Kochenderfer M., "Predicting the behavior of interacting humans by fusing data from multiple sources", *Uncertainty in Artificial Intelligence 2012*, K. Murphy (Ed.), 2012.

Lee, R., Wolpert, D.H., Backhaus, S. Bent, R., Bono, J., Tracey, B., "Counter-Factual Reinforcement Learning: How to Model Decision-Makers That Anticipate the Future", *Decision-Making with Imperfect Decision Makers 2012*, T. Guy, M. Karny and D.H.Wolpert (Ed.'s), Springer, 2012.

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Wolpert, D. H. and Jamison, J. "The Strategic Choice of Preferences: the Persona Model", *Berkeley Electronic Journal of Theoretical Economics*, 2011.

Lee, R. and Wolpert, D.H., "Game-Theoretic Modeling of Human Behavior in Mid-Air Collisions", *Decision-Making with Imperfect Decision Makers 2011*, T. Guy, M. Karny and D.H.Wolpert (Ed.'s), Springer.

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Wolpert, D.H., Bieniawski, S.R., "Distributed Control by Lagrangian Steepest Descent", in *Proceedings of IEEE Conference on Decision and Control*, 2004.

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Bieniawski, S., Kroo, I., and Wolpert, D. H., "Discrete, Continuous, and Constrained Optimization Using Collectives," AIAA Paper 2004-4580, 10th AIAA/ISSMO *Multi-disciplinary Analysis and Optimization Conference*, Albany, NY, August 30-September 1, 2004.

Wolpert, D.H., Bieniawski, S., "Distributed Adaptive Control: Beyond Single-Instant, Discrete Variables", in MSRAS 04, Springer-Verlag, 2004.

Wolpert, D.H., "What Information Theory says about Bounded Rational Best Response", in WEHIA 04, A. Namatame (Ed.), Springer-Verlag, 2004.

Bieniawski, S.R., Wolpert, D.H., "Adaptive, distributed control of constrained multi-agent systems", in *Autonomous Agents and Multi-Agent Systems 2004*, 2004.

Lee, C.F., Wolpert, D.H., "Product distribution theory for control of multi-agent systems", in *Autonomous Agents and Multi-Agent Systems 2004*, 2004.

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Bieniawski, S.R., Wolpert, D.H., "Product Distributions for Distributed Optimization", in *International Conference on Complex Systems 2004*, Y. Bar-Yam (Ed.), Perseus books, 2004.

Macready, W., Wolpert, D.H., "Distributed Constrained Optimization", in International *Conference on Complex Systems 2004*, Y. Bar-Yam (Ed.), Perseus books, 2004.

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Antoine, N.E., Bieniawski, S.R., Kroo, I.M., Wolpert, D.H., "Fleet Assignment using collective intelligence", AIAA-2004-0622, Presented at the 42nd Aerospace Sciences Meeting, 2004.

Wolpert, D.H., Tumer, K., Bandari, E. "Improving search algorithms by using intelligent coordinates", *Physical Review E (Brief Communications)*, **69**, 017701, 2004.

Tumer, K., Wolpert, D.H., "A Survey of Collective Intelligence", in Tumer, K., and Wolpert, D.H. (Ed.'s) *Collectives and the Design of Complex Systems*, Springer-Verlag, 2004.

Wolpert, D.H., "The Theory of Collectives", in Tumer, K., and Wolpert, D.H. (Ed.'s) Collectives and the Design of Complex Systems, Springer-Verlag, 2004.

Airiau, S., Wolpert, D.H., Sen, S., and Tumer, K., "Providing effective access to shared resources: a COIN approach", *Proceedings of ESOA '03*, A. Karageorgos et al., 2003.

Wolpert, D.H., and Tumer, K., "Beyond Mechanism Design", *International Congress of Mathematicians 2002 Proceedings*, H. Gao et al. (Ed.s), Qingdao Publishing, 2002.

Lawson, J., and Wolpert D. H., "The Design of Collectives of Agents to Control Non-Markovian Systems", *Proceedings of American Association of Artificial Intelligence Conference 2002*, 2002.

Wolpert, D.H, and Lawson, J., "Designing Agent Collectives For Systems With Markovian Dynamics", in *Proceedings of First International Joint Conference on Autonomous Agents and Multi-Agent Systems*, 2002.

Tumer, K., Agogino, A, and Wolpert, D.H., "Learning Sequences of Actions in Collectives of Autonomous Agents", in *Proceedings of First International Joint Conference on Autonomous Agents and Multi-Agent Systems*, 2002.

Wolpert, D.H., and Tumer, K., "Optimal Reward Functions in Distributed Reinforcement Learning", *Intelligent Agent Technology* 2001, 2002.

Wolpert, D.H., Tumer, K. "Collective Intelligence, Data Routing, and Braess' Paradox", *Journal of Artificial Intelligence Research*, 2002.

Wolpert, D.H., "Collective Intelligence", in Computational Intelligence Beyond 2001: Real and Imagined, D. Fogel and D. Robinson (Ed.), Wiley, 2001.

Wolpert, D., and Tumer, K., "Optimal Payoff Functions for Members of Collectives", *Advances in Complex Systems*, Vol. 4, pp. 265-280, 2001.

Wolpert, D.H., Sill, J., and Tumer, K., "Using Collective Intelligence to Control Data Flow Across a Constellation of Satellites", *Proceedings International Joint Conference on AI 2001*, Morgan Kauffman, 2001.

Wolpert, D.H., and Tumer, K., "An Illustration of the COIN Approach to Design of Multi-Agent Systems", *Proceedings of the Agents 00 and ECML 00 Workshop on Learning in Agents*, Sen. S et al. (Ed.'s), 2000.

Tumer, K., and Wolpert, D.H. "Collective Intelligence and Braess' Paradox", in *Proceedings of AAAI 2000*, Morgan Kauffman, 2000.

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Wolpert, D.H., Kirshner, S., Tumer, K., Merz, C., "Adaptivity in Agent-Based Routing for Data Networks", in *Proceedings of Agents 00*, Sierra, C., et al, (Ed.s), 2000.

Wolpert, D.H., Wheeler, K., Tumer, K., "Collective Intelligence for Control of Distributed Dynamical Systems", *Europhysics Letters*, vol. 49 issue 6, 708-714, 2000.

Wolpert, D.H., Wheeler, K., Tumer, K., "General Principles of Learning-based Multi-Agent Systems", *Third International Conference of Autonomous Agents*, J.E. Bradshaw (Ed.), ACM Press, 77-83, 1999.

Wolpert, D.H., Tumer, K., Frank, J. "Using collective intelligence to route internet traffic", *Neural Information Processing Systems 11*, Kearns et al. (Eds), MIT Press, 952-958, 1999.

## Statistical Inference and information theory/

Wolpert, D.H., "The Implications of the No-Free-Lunch Theorems for Meta-induction", Special Issue of *J. General Philosophy of Science* on "The Problem of Induction: Meta-Inductive Approaches", P. Thorn and S. Psillos, (Ed.), in press

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Kolchinsky, A., Tracey, B., and Wolpert, D.H., "Nonlinear Information Bottleneck", *Entropy*, 2019; **Selected for journal cover**; **Won Entropy best paper of year award 2021** 

Tracey, B., and Wolpert, D. "Upgrading from Gaussian Processes to Student's-T Processes", 2018 AIAA Non-Deterministic Approaches Conference, AIAA SciTech Forum, (AIAA 2018-1659), 2018

Rauh, J., Banerjee, P., Olbrich, E., Jost, J., Bertschinger, N., and Wolpert, D.H., "Coarse-Graining and the Blackwell Order", *Entropy*, 2017

Grana, J., Wolpert, D.H., Neil, J., Xie, D., Bhattarchaya, T., Bent, R., "A Likelihood Ratio Anomaly Detector for Identifying Within-Perimeter Computer Network Attacks", *Journal of Network and Computer Applications*, 2016

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Kohavi, R., and Wolpert, D.H., "Bias Plus Variance Decomposition for Zero-One Loss Functions", *Proceedings of the International Machine Learning Conference 13*, Ed. Lorenza and Saiita, Morgan Kauffman,1996.

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Wolpert, D.H., "On the Connection Between In-Sample Testing and Generalization Error", Complex Systems, 6, 47-94, 1992.

Wolpert, D.H., "The Relationship Between Occam's Razor and Convergent Guessing", Complex Systems, 4, 319-368, 1990.

Wolpert, D.H., "Using a Mathematical Theory of Generalization to Construct a Generalizer Superior to NETtalk", Neural Networks, 3, 445-452, 1990.

Wolpert, D.H., "A mathematical Theory of Generalization: part I, part II", Complex Systems, **4**,151-200, 201-249, 1990.

Wolpert, D.H., "A benchmark for how well neural nets generalize", *Biological Cybernetics*, **61** 303-313, 1989.

## **Optimization and Search/**

Lam, R., Willcox, K., Wolpert, D.H., "Bayesian Optimization with a Finite Budget: An Approximate Dynamic Programming Approach", *Proceedings Neural Information Processing Systems*, 2016

Tracey, B. Wolpert, D.H., and Alonso, J.J., "Using Supervised Learning to Improve Monte Carlo Integral Estimation", *AIAA Journal*, 2013.

Wolpert, D. H. and Rajnarayan, D. "Using machine learning to improve Stochastic Optimization", *Proc. AAAI 2013*.

Wolpert, D.H., "What the no free lunch theorems really mean; how to improve search algorithms", *Ubiquity Symposium on Evolutionary Computation and the Processes of Life*, ACM, ubiquity.acm.org/symposia.cfm, Dec. 2013.

Nadiga, B. and Wolpert, D.H., "Exploiting models of different complexities for state and parameter estimation", *Geophysical Research Abstracts*, Vol. 15, EGU2013-3480, 2013

Tracey, B. Wolpert, D.H., and Alonso, J.J., "Using Supervised Learning to Improve Monte Carlo Integral Estimation", 13th AIAA Non-Deterministic Approaches Conference, Denver, CO, April 2011, AIAA Paper 2011-1843.

Wolpert, D. H., Rajnarayan, D., and Bieniawski S., "Probability Collectives in Optimization", *Handbook of Statistics*, C.R. Rao and V. Govindaraju (Ed.'s), Vol. 31, 2013, 61–99

Rajnarayan, D., and Wolpert, D. H. "Bias-Variance trade-offs: Novel Applications", *Encyclopedia of Machine Learning*, Claude Sammut, Geoffrey I. Webb (Ed.'s), Springer, 2011.

Rajnarayan, D. and Wolpert, D.H., "Bias-Variance Techniques for Monte Carlo Optimization: Cross-validation for the CE Method", arXiv:0810.0877v1, 2008.

Rajnarayan, D. and Wolpert, D.H., "Exploiting Parametric Learning to Improve Black-Box Optimization", *Proc. ECCS 2007*, J. Jost et al. (Ed.)

Rajnarayan, D., Wolpert, D.H., Kroo, I. "Optimization Under Uncertainty Using Probability Collectives", *Proc.* 11 AIAA/ISSMO Multidisciplinary Analysis and Optimization Conference, Portsmouth, VA, AIAA-2006-7033, 2006.

Wolpert, D.H., and Lee, C.F., "An adaptive Metropolis-Hastings scheme: sampling and optimization", *Europhysics Letters*, **76**, 353-359, 2006.

Wolpert, D.H., and Macready, W.G., "Coevolutionary Free Lunches", *IEEE Transactions on Evolutionary Computation*, **9**, 721-735, 2005.

Koeppen, M., Wolpert, D. H., Macready, W. G., "Remarks on a Recent Paper on the 'No Free Lunch' Theorems", IEEE *Transactions on Evolutionary Computation*, **5**, pp. 295-296, June 2001.

Macready, W.G., and Wolpert, D.H., "Bandit Problems and the Exploration/Exploitation Tradeoff", *IEEE Transactions on Evolutionary Computation*, **2**, 2-22, 1998.

Wolpert, D.H., and Macready, W.G., "No Free Lunch Theorems for Optimization", *IEEE Transactions on Evolutionary Computation*, **1**, 1997.

Macready, W.G., and Wolpert, D.H. "What Makes an Optimization Problem Hard?", *Complexity*, **5**, 1996.

## Other topics/

Wolpert, D.H., Flack, J., Editors of special issue of *Entropy*, "Foundations of Biological Computation", 2022.

Wolpert, D.H., Kinney, D., "Noisy Deductive Reasoning: How Humans Construct Math, and How Math Constructs Universes", in *Undecidability*, *Uncomputability*, and *Unpredictability*, A. Aguirre et al. (Ed.'s), Springer, 2021.

Wolpert, D.H., "Theories of knowledge and theories of everything", in *The Map and the Territory*, Shyam Wuppuluri and Francisco Antonio Doria (Ed.'s), Springer, 2019.

Kempes, C.P., Van Bodegom, P., Wolpert, D., Libby, E., Amend, J., Hoehler, "Drivers of bacterial maintenance and minimal energy requirements", *Frontiers in Microbiology*, 2019

Wolpert, D.H., J. Grochow, E. Libby, S. DeDeo, "The many faces of state space compression" in *From Matter to Life: Information and Causality*, Walker, Ellis and Davies (Ed.'s), Cambridge University Press, 2017, 199-243.

Wolpert, D.H., Macready, W., "Using Self-dissimilarity to Quantify Complexity", *Complexity*, **12**, 2007.

Wolpert, D.H., Macready, W., "Self-dissimilarity as a high dimensional complexity measure", in *International Conference on Complex Systems 2004*, Y. Bar-Yam (Ed.), Perseus books, 2004.

Wolpert, D.H., "Metrics for more than two points at once", in *International Conference on Complex Systems 2004*, Y. Bar-Yam (Ed.), Perseus books, 2004.

Wolpert, D.H., MacLennan, B. J., "A Computationally Universal Field Computer with Linear Dynamics", Neural Computation.

Wolpert, D.H., and Macready, W.G., "Self-Dissimilarity: An Empirically Observable Measure of Complexity", in *Unifying Themes in Complex Systems*", Y. Bar-Yam (Ed.), Perseus books, 2000.

Wolpert, D.H., and Maclennan, B., "A Computationally Universal Field Computer that is Purely Linear", in *Proceedings of the 5th Joint Conference on Information Sciences*", (Atlantic City, NJ, Feb. 27 - Mar. 3, 2000), I, pp. 782-5, Paul P. Wang (Ed.), ACM Press, 2000.

#### **BOOKS:**

Bird, D., Kohler., T., and Wolpert, D.H., (Ed.), *Evolution of Collective Computational Abilities of (Pre)historic Societies*, special issue of Journal of Social Computing, in press

Wolpert, D., Kempes, C., Stadler, P., Grochow, J. (Ed.), *The Energetics of Computing in Life and Machines*, Santa Fe Institute Press, 2019.

Guy, T., Karny, N. and Wolpert, D.H., (Ed.), *Proceedings of ECML 2013 workshop on "Scalable decision making: Uncertainty, Imperfection, Deliberation"*, Springer, 2015.

Guy, T., Karny, N. and Wolpert, D.H., (Ed.), *Proceedings of NIPS 2011 workshop on "Decision Making and Imperfection"*, Springer, 2013.

Guy, T., Karny, N. and Wolpert, D.H., (Ed.), *Proceedings of NIPS 2010 workshop on "Decision Making with Imperfect Decision Makers"*, Springer, 2012.

Tumer, K. and Wolpert, D.H. (Ed.), Collectives and the Design of Complex Systems, Springer, 2004.

Wolpert, D.H. (Ed.), The Mathematics of Generalization, Addison-Wesley, 1994.

#### **ARTICLES WRITTEN FOR POPULAR PRESS:**

Wolpert, D.H., "A sliver of reality", Aeon magazine, Sept., 2022

Wolpert, D.H., "Why do computers take so much energy?", Scientific American, Oct. 4, 2018

#### **STUDENTS**:

Currently the primary supervisor of a graduate student officially enrolled at MIT

Co-advised PhD students: Stefan Bieniawski (Stanford), Dev Rajnarayan (Stanford), Brendan Tracey (Stanford), Justin Grana (American University)

Thesis reviewer for students at: UC-Irvine, University of Waterloo, University of Pretoria, University of Leipzig, University of Luxembourg, Imperial College London, Columbia University, International Center for Theoretical Physics

REU / UCR advisor of 6 interns including four minorities and two women (Jaewon Shin, Edward Chang, Gulce Kardes, Jin Hong Kuan, Milo Trujillo, Eliana Krakovsky)

Co-authored 26 papers with 13 students. In 16 of the papers the student was first author.

Participated in many years of Omidyar postdoctoral fellow application reviews at SFI.

#### **TEACHING:**

International Center for Theoretical Physics, Trieste, February 2022. Taught intensive graduate course (18 hours of lectures with two exams and several homeworks) on "Thermodynamics and computation".

Center of Excellence Cognitive Interaction Technology, Bielefeld, September 2010, Summer school lecturer (5 hours of lectures).

Tsinghua University, Center for Intelligent Networked Systems, Beijing, October 2005. Visiting professor. Taught intensive graduate course (10 hours of lectures and an exam) on "Advances in Complex Systems".

Santa Fe Institute, multiple years. Taught in Complex Systems Summer school (3 hours of lectures on average).

#### **MISCELLANEOUS:**

Fellow of IEEE

Member of FQXi

Research Associate of Info-metrics Institute, American University

Collaborator of Purdue Center for Sciences of Information

## Associate Editor (current only):

Advances in Complex Systems
IEEE Transactions on Evolutionary Computation
ACM Transactions on Autonomous and Adaptive Systems
Theory in Biosciences
Journal of Social Computing
Entropy

## Member of Editorial Board (current only):

Journal of Physics: Complexity
Journal of Artificial Intelligence Research
Journal of Economic Interaction and Coordination
Reviews of Behavioral Economics
Cancer Convergence
Collective Intelligence

## Member of council (current only):

The Socio-Economic Science with Heterogeneous Interacting Agents Society

#### Member of Advisory Board (current only):

Handbook of Natural Computing, Springer Sci, MDPI
Santa Fe Institute Press

## Virtual Faculty (current only):

Bielefeld University Cluster on Cognitive Interaction Technology

### Bios Fellow.

Member of multiple NSF panels. Member of NCI panel. Reviewer for multiple Belgium FRS-FNRS grants. Reviewer for multiple ERC grants. Reviewer for Dutch Research Council grant.

US Patent 5,535,301 on Stacked Generalization.

US patent 09/160,828 (1998) for Surfaid Predictor.

US patent (1999) for Masked Proportional Routing.

Top two winners of 2009 Netflix competition made extensive use of my patented Stacked Generalization technique. (See Sill, J. and Takacs, G. and Mackey L. and Lin D, "Feature-Weighted Linear Stacking", at arXiv:0911.0460.)

Second place in 2020 FQXi essay contest (\$5000 prize)

#### **CO-ORGANIZED**:

- 2022 International Center for Theoretical Physics meeting on *The adjacent* possible fields of stochastic thermodynamics
- 2022 SFI / NSF working conference on *The Future of the thermodynamics of computation*
- 2022 American Physical Society March meeting, two focus sessions
- 2022 Workshop on Stochastic Thermodynamics III
- 2021 SFI / NSF working conference on *The Future of the thermodynamics of computation*
- 2021 SFI working group on *Dynamics of the off-equilibrium brain:* information processing and energy flows
- 2021 Workshop on Stochastic Thermodynamics: Junior Women's Caucus (hosted this workshop at SFI)
- 2021 American Physical Society March meeting, 2 focus sessions
- 2021 Workshop on Stochastic Thermodynamics II (hosted at SFI)
- 2020 SFI workshop on *Evolution of Collective Computational Abilities of* (*Pre*)*Historic Societies*
- 2020 Workshop on Stochastic Thermodynamics in Complex Systems (With Jan Korbel created the WOST annual series of workshops, which now has over a thousand participants per year.)
- 2020 American Physical Society March meeting, 2 focus sessions
- 2020 SFI working group on *The Interplay of Large-Scale Impersonal Trends, Big Ideas, and Great Leaders in History*
- 2019 SFI workshop on What is Biological Computation?
- 2019 SFI working group on *Thermodynamic and Computational Efficiency* in Cellular Chemical Reaction Networks
- 2018 SFI working group on Lookahead Optimization
- 2017 SFI workshop on *Information Networks and the Evolution of Social Organization*

- 2017 SFI workshop on *Thermodynamics and Computation: toward a new synthesis*
- 2017 SFI workshop on Thermodynamics of Computation in Chemical and Biological Systems
- 2016 NIPS workshop on *Imperfect Decision Makers: Admitting Real-World Rationality*
- 2016 SFI workshop on Statistical Physics, Information Processing and Biology
- 2014 SFI working group on Major Transitions in Natural, Synthetic, and Artificial Evolution
- 2014 SFI working group on *Information Theory, Ecosystems, and Schrodinger's Paradox*
- 2013 SFI / LANL working group on Multi-Information Source Optimization
- 2012 SFI / LANL working group on Multi-Information Source Optimization
- 2012 SFI / LANL Theme week on *Combining Information Theory and Game Theory*
- 2011 NIPS workshop on *Decision Making with Multiple Imperfect Decision Makers*
- 2010 NIPS workshop on Decision Making with Multiple Imperfect Decision Makers
- 2010 Santa Fe Institute / Center for Nonlinear Studies workshop and mini-program on *Decentralized control of strategic agents*
- 2010 Perimeter Institute workshop on the Foundations of physics
- 2009 Oxford-Man Institute workshop, From Game Theory to Game Engineering
- 2008 Beyond Institute workshop on The Nature of the Laws of Physics
- 2005 NIPS workshop on Game Theory, Machine Learning and Reasoning under Uncertainty
- 2005 Center for Nonlinear Studies workshop on Collectives
- 2004 Special Session on *Product Distribution Theory* at The 2004 International Conference on Complex Systems (invited organizer)
- 2003 Stanford/NASA workshop on Collective Intelligence
- 2002 NASA workshop on Collective Intelligence
- 2001 Santa Fe Institute / NASA workshop on Collective Intelligence
- 2002 WCCI Special Track on Distributed Learning for Optimization
- NIPS-98 Workshop on Turnkey Algorithms for Improving Generalizers
- The AAAI-96 Workshop on *Integrating Multiple Learning Methods*. Co-edited the associated special issue of *Machine Learning Journal*
- Spring 1996 AAAI Symposium on Computational Issues in Learning Models of Dynamical Systems
- 1992 Center for Nonlinear Studies / Santa Fe Institute workshop on Mathematics of Generalization

#### **REVIEWED FOR:**

ACM Transactions on Autonomous and Adaptive Systems

AIAA journal

Air Force Office of Scientific Research

AISTATS 2023

Artificial General Intelligence 2010, 2011

Artificial Intelligence and Statistics 2011

Artificial Life

American Control Conference 2011, 2012, 2018, 2022

The American Statistician

American Association for Artificial Intelligence Conferences

American Association for Artificial Intelligence Symposia

American Journal of Epidemiology

Annals of Mathematics and Artificial Intelligence

Annals of Operations Research

Annals of Physics

**Annals of Statistics** 

Arabian Journal for Science and Engineering

Army Research Office

Artificial Intelligence

Artificial Intelligence and Mathematics

Asia-Pacific Conference on Intelligent Agent Technology 2001

Automatica

Autonomous Agents and Multi-agent systems '03

Autonomous Agents and Multi-agent systems '04

Autonomous Agents and Multi-agent systems '05

Journal of Autonomous Agents and Multi-agent systems

**Axioms** 

**Axios** 

Bayesian Analysis

Belgium, Fund for Scientific Research - FRNS

Bernoulli Journal

Big Data and Society

**Biological Theory** 

Biophysical Journal

Brain Research Bulletin

**Brain Sciences** 

**Briefings in Bioinformatics** 

British Journal for the Philosophy of Science

Cambridge University Press

Cell Reports Physical Science

Center for Sciences of Information

Center for Nonlinear Studies

Chaos

Cognitive Information Processing 2008

Collective Intelligence

Communication Physics Nature

Complexity

Complexus

Complexis conference 2016

Complex Systems

Computers and Operations Research

**Connection Science** 

Conference on Decision and Control 2001

Congress on Evolutionary Computation 2004

Congress on Evolutionary Computation 2009

Czech Science Foundation

The Open Cybernetics and Systemics Journal

**Decision Support Systems** 

DOE office of Basic Science

**Dutch Research Council** 

Econometrica

Engineering self-organizing applications 2003

Engineering and Physical Sciences Research Council

Engineering Societies in the Agents World, 2008

**Entertainment Computing** 

Entropy

**EURASIP Journal on Applied Signal Processing** 

European Conference on Complex Systems

**EPL** 

**European Physical Journal Plus** 

European Research Council Advanced Grant Call

European Research Council Europa Consolidator Grant 2021

**Europhysics Letters** 

**Evolutionary Computation** 

Foundations of Evolutionary Algorithms 2000

Foundations of Physics

Foundations of Science

Fund for Scientific Research (Belgium)

**FOX** 

Frontiers in Evolutionary Algorithms 2000

Frontiers in Physics

Games and Economic Behavior

Global Environmental Change

Handbook of Natural Computing

**Human Movement Review** 

**Human Movement Science** 

IBM Journal of Research and Development

**ICML 2015** 

**ICML 2019** 

ICPRAM 2011

**IEEE Communications Letters** 

**IEEE Control Systems Conference 2011** 

IEEE International Symposium on Cluster Computing and the Grid 2001

**IEEE Intelligent Systems** 

**IEEE Transactions on Evolutionary Computation** 

IEEE Transactions on Knowledge and Data Engineering

**IEEE Transactions on Neural Networks** 

IEEE Transactions on Neural Networks and Learning Systems

IEEE Transactions on Pattern Analysis and Machine Intelligence

IEEE Transactions on Systems, Man and Cybernetics, A and B

Infometrics Institute 2011 workshop on Philosophy of Information

Information

Information Fusion

Information Geometry

**Information Processing Letters** 

Information Sciences

**INFORMS** Journal on Computing

Israeli Research Foundation

Intelligent Agent Technology 2001

Intl. symposium on Innovations in Intelligent Systems and Applications 2007

International Conf. Complex Systems 2011

International Journal of Business Intelligence and Data Mining

**INISTA 2007** 

Institute for Mathematics and its Applications

**Interdisciplinary Science Reviews** 

International Center for Theoretical Physics

International Joint Conference on Artificial Intelligence

International Conference on Complex Systems 2004

International Conference on Machine Learning and Applications

International Joint Conference on Neural Networks

International Workshop on Multiple Classifier Systems

Iranian Journal of Management Studies

Isaac Newton Institute for Mathematical Sciences

Israeli Science Foundation

John Templeton Foundation

Joint Conference on Intelligent Systems

Journal of Aerospace Engineering

Journal of Artificial Intelligence Research

Journal of Autonomous Agents and Multi-Agent Systems

Journal of Biological Physics

Journal of Chemical Information and Modeling

Journal of Chemical Physics

Journal of Combinatorial Optimization

Journal of Computational and Graphical Statistics

Journal of Computer Science Applications and Information Technology

Journal of Heuristics

Journal of General Philosophy of Science

Journal of History of Economic Thought

Journal of Machine Learning Research

Journal of Neural Networks

Journal of Optimization

Journal of the Royal Society, Interface

Journal of the Royal Statistical Society, B

Journal of Statistical Physics

Journal of Theoretical Biology

**Keck Foundation** 

Knowledge Discovery and Data Mining Conference

Machine Learning

The Marsden Fund of The Royal Society of NZ

**Mathematics** 

Mathematical Reviews

Max Planck Institute for Intelligent Systems, Search committee for Director

Maximum Entropy and Bayesian Methods Conference

MCS 2000

**MIND** 

NASA Astrobiology Institute

**National Science Foundation** 

Nature

**Nature Communications** 

**Nature Physics** 

Nature Scientific Reports

National Cancer Institute

National Science Foundation (more than half a dozen divisions)

Netherlands Organization for Scientific Research

**Neural Computation** 

**Neural Networks** 

**Neural Information Processing Systems Conference** 

Oxford University Press

Philosophical Transactions A

Philosophy of Science

Physica A

Physica D

Physical Review E

Physical Review Letters

Physical Review Research

Physical Review X

Physics Essays

Physics Letters A

PLoS One

**PLoS Computational Biology** 

Proceedings of the National Academy of Sciences (PNAS)

Proceedings of the Royal Society A

Progress in Biophysics and Molecular Biology

Journal of the Royal Statistical Society B

Recent Patents on Engineering

Remote Sensing

Research Foundation Flanders

**Reviews of Behavioral Economics** 

Royal Society Wolfson Research Merit Award

Royal Society Leverhulme Trust Award

Science

Science Advances

Scientific Reports

SIAM Review

Society for Economics and Heterogeneous Interacting agents

Soft Computing

Sustainability

Swiss National Science Foundation

Synthese

**Theoretical Computer Science** 

Theory in Biosciences

**Templeton World Charity Foundation** 

1999 Workshop on Economics with Heterogeneous Interacting Agents

First International Workshop on Theory and practice of open computational systems

WCCI 2008

#### **INVITED PRESENTATIONS AND DISCUSSION PANELS:**

Agents '00 "Infrastructure for Scalable Multi-Agent Systems" workshop. American Assoc. for Advancement of Science 1995 Panel on Artificial Life

American Mathematical Society Mt. Holyoke 1996 Workshop on Statistics

American Physical Society March 2021 meeting

Arizona State University, Mathematics and Cognition Seminar

Arizona State University, Biosocial Complexity Initiative

**Arris Corporation** 

Aladdin Project Review (keynote speech) 2009

Beilstein-Bozen symposium, 2018

Beyond Institute on General Principles of Increasing Complexity

Bremen University

Brigham Young University, Computer Science Dept.

Bristol University, Computer Science Dept.

Brookings Inst. Workshop on Multi-Agent Comp. in Economies 2002

Brown University Chemistry Department

Cal State Fresno, Business School

Cal State Fresno, Physics Dept.

Cal State Fresno, Computer Science Dept.

Cal Tech, Center for Neuromorphic Systems Engineering

Cal Tech, Control and Dynamical Systems

Cal Tech, Physics Research Conference (sole speaker)

Cambridge University, Newton Institute of Mathematics

Center for Nonlinear Studies (Los Alamos)

CNLS conference: Unconventional Computation: Quo Vadis? 2007

Centro de Ciencias de la Complejidad

Complexity Science Hub, Vienna

Cognitive Computing 2018 (Hanover), (**keynote speech**)

Conference on Complex Systems (three talks) 2015

Conference on Complex Systems (invited speaker) 2017

Complexity, Criticality and Computation 2017 (keynote speech)

Computation in Natural Systems 2018 (keynote speech)

Computability in Europe 2010 (plenary speaker)

Conferences on Computational Learning Theory and Natural Learning Systems (several)

Conference on Cognitive Computing - Merging Concepts with Hardware 2018 (plenary speaker)

Conference on Control and Decision Theory 2004

Control Mechanisms for Complex Systems 1996 International Workshop

Conference in honor of Reuven Rubinstein 2008

Conference on Evolutionary Computation 2000 (banquet speech)

Conference on Evolutionary Computation 2005 (keynote speech)

Courant Institute

Cowles Foundation 2009 workshop on simplicity and likelihood

Dynamics of multilevel systems 2015 workshop

Dynamics of multilevel systems 2015 (summer school lecturer)

Entropy 2018 (keynote speech)

Evolution, Cooperation and Rationality workshop, 2009 (Bristol, UK)

European Conference on Complex Systems, Future of Complex

Transportation Systems workshop, 2011

Guided self-organization 2018 (keynote speech)

IEEE Symposium on Foundations of Computational Intelligence '07

# (keynote speech)

IEEE Beijing Frontiers of Machine Intelligence 2016 (keynote speech)

FQXi biannual conference, 2016

Fusion Engineering and Design

Workshop on High Performance Object Databases, Cardiff '00

HP Research Labs (Palo Alto)

IBM Yorktown Heights Research Center

IBM Informational Lens Workshop

ICML 2000 workshop on What Works Well Where

ICML 2000 workshop on multi-agent systems

Imperial College London, Statistics Department

Infometrics conference (multiple meetings)

Information Engines at the Frontiers of Nanoscale Thermodynamics, 2016

Institute for Human and Machine Cognition

Institute for New Economic Thinking (Oxford)

Workshop on Intelligent Agents for Imagery & Geospatial Analysis 2000

Institute of Science and Technology Austria, Physics Department, 2019

International Center for Theoretical Physics

International Conference of Social Computing, Tsinghua university, 2020

International Conference for Learning Representations 2022, (invited)

The International Computer Science Institute

Jet Propulsion Laboratory

Keio university, Physics Dept.

Likelihood and Simplicity, Bar-Ilan University,

London School of Economics, Mathematics Dept.

Luxembourg University, Physics Dept.

Max Planck Institute for Mathematics in the Natural Sciences

Max Planck Institute "Math Concepts in Sciences and Humanities" (invited)

Maximum entropy and Bayesian Analysis conference, 2016

# (keynote speech)

Microsoft Corporation

Modeling Complex Systems '02

Monitoring, security, and rescue tasks in multi-agent systems

# (keynote speech)

MIT Artificial Intelligence Lab

MIT Lincoln Laboratories

NASA Center for Computational Astrobiology kickoff panel discussion

Nanyang Technical University, Physics Department

NEC Corporate Research Lab

New England Complex Systems Institute

Neural Information Processing Systems main conference

Neural Information Processing Systems workshop on Combining generalizers

Neural Information Processing Systems workshop on Occam's Razor

Neural Information Processing Systems workshop on Electronic Commerce NIMBioS workshop on *Information and Entropy in Biological Systems*, 2015 NORDITA workshop on "Statistical Physics of Complex Systems", 2019 Complexity Science Hub Vienna, "Information-theoretic Methods for

Complexity Science", 2019

Oxford University, Computer Science Dept.

Oxford University, Applied Mathematics Dept.

Oxford - Man Institute

Parmenides Foundation, Re-Thinking Matter, Life, Mind 2018

## (plenary speech)

Perimeter Institute

Princeton Center for Physics of Biological Function

Purdue University, Computer Science Dept

Pyeongchang forum, 2019, (keynote speech)

RAND, Santa Monica, 2015

RAVE 2009, Barcelona (**keynote speech**)

Workshop on Re-conceptualizing the Origin of Life, Carnegie Institute, 2016

Rocky Mountain Conference on Artificial Intelligence

Rome 2010 Science Festival (plenary speech)

Royal Statistical Society

Sandia Complex Systems Department (distinguished lecturer)

San Jose State University physics department

ScienceFoo 2009

Seoul National University, Physics Dept., 2019

Snowbird conference on neural computing

SIAM 2013 mini-symposium on Multi-information source optimization

SIAM 2014 mini-symposium on Multi-fidelity optimization

Siemens Corporate Research

Self Optimizing Systems NSF workshop (keynote speech)

Solvay workshop on Nonequilibrium and nonlinear phenomena in statistical mechanics

SPIE 2008 (**keynote speech**)

Stanford, Aeronautics and Aerospace Dept.

Stanford, Computer Science Dept.

Stanford, Psychology Dept.

Stanford, Statistics Dept.

Statistical Mechanics Workshop, 2016

"Strategies for Implementing Large Scale Emergent Systems" Workshop SUNY Albany Physics Dept.

Symposium on Understanding Complex Systems 2005 (keynote speech)

Symposium on Frontiers of Machine Intelligence 2016 (keynote speech)

Theory and practice of open computational systems 2003

Thermodynamic Computing workshop, 2019

Tsinghua university computer science and physics departments, 2016

UC Berkeley, Statistics Dept.

UC Davis, Computer Science Dept.

UC Irvine, Institute for Mathematical Behavioral Sciences

UCLA, Aerospace Dept.

UCLA, Statistics Dept.

UC San Diego, Politics Dept.

UC Santa Cruz, Computer Science Dept.

UC Santa Cruz, Applied Math Dept.

USC, Computer Science Dept.

University of Georgia, Dept. of Physics and Astronomy

University of Luxembourg, Physics Dept.

University of New Mexico, Physics Dept.

University of New Mexico, Computer Science Dept.

University of Tokyo, Physics Dept.

University of Warwick, Economics Dept.

UT Austin, Physics Dept.

World Conference on Soft Computing (plenary speech) 2002

World Congress on Computational Intelligence (plenary speech) 2002

Workshop on Econ. and Heterog. Interactive Agents (plenary speech) 2004

Wright-Patterson AFRL Technical Interchange Meeting on multi-fidelity optimization 2013

Yale University Physics Department

#### **PEER-REVIEWED AWARDS:**

Best Paper Award for IEEE Trans. Evolutionary Computation, Vol. 1

Best Paper Award for IEEE Trans. Evolutionary Computation, Vol. 2

Superior Accomplishment Award for NASA Code IC for 1999

TXN fellow

NIH Postdoctoral Fellowship

LANL Director's Postdoctoral Fellowship

UC DuPont Fellowship

UC Regent's Fellowship

Princeton University Physics Department Kusaka Prize