# **Artemy Kolchinsky**

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**EDUCATION Indiana University**, Bloomington, IN, 2015

Ph.D. in Informatics (focus in Complex Systems), Minor in Cognitive Science Thesis: "Measuring Scales: Integration and Modularity in Complex Systems"

Committee: Luis M. Rocha (chair), Yong-Yeol Ahn, Randall Beer, Alessandro Flammini, Olaf Sporns

New York University, New York, NY, 2004

B.A. Magna Cum Laude, Individualized Study (concentration in Complex Systems)

**ACADEMIC** Santa Fe Institute, Santa Fe, NM, Dec 2015-Present

POSITIONS Postdoctoral fellow

Instituto Gulbenkian de Ciência, Oeiras, Portugal, 2009-2010 and Summer 2008/2011/2012

Visiting researcher at FLAD Computational Biology Collaboratorium

**Indiana University**, Bloomington, IN, 2011-2015 Research assistant with Ph.D. advisor Luis M. Rocha

**INDUSTRY** LinkedIn Corporation, Mountain View, CA, Summer 2014

Data science internship. Supervisor: Mathieu Bastian

PUBLICATIONS

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

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

**A. Kolchinsky**, D.H. Wolpert, "Thermodynamic costs of Turing Machines", *Physical Review Research*, 2020. pdf

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

**A. Kolchinsky** and B. Corominas-Murtra, "Decomposing information into copying versus transformation", *Royal Society Interface*, 2020. pdf

A.M. Saxe, Y. Bansal, J. Dapello, M. Advani, A. Kolchinsky, B.D. Tracey, D.D. Cox, "On the information bottleneck theory of deep learning", *Journal of Statistical Mechanics*, 2019. pdf code

**A. Kolchinsky**, B.D. Tracey, D.H. Wolpert, "Nonlinear information bottleneck", *Entropy*, 2019. pdf (*Entropy* 2021 Best Paper Award)

A. Berdahl, C. Brelsford, C. De Bacco, M. Dumas, V. Ferdinand, J.A. Grochow, L. Hébert-Dufresne, Y. Kallus, C.P. Kempes, **A. Kolchinsky**, D. B. Larremore, E. Libby, E.A. Power, C.A. Stern, B.D.Tracey, "Dynamics of beneficial epidemics", *Scientific Reports*, 2019. pdf

E.A. Hobson, V. Ferdinand, **A. Kolchinsky**, J. Garland, "Rethinking animal social complexity measures with the help of complex systems concepts", *Animal Behaviour*, 2019. pdf

**A. Kolchinsky**, B.D. Tracey, S. Van Kuyk, "Caveats for information bottleneck in deterministic scenarios", *International Conference on Learning Representations (ICLR)*, 2019. pdf code

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

A. Avena-Koenigsberger, X. Yan, **A. Kolchinsky**, M. van den Heuvel, P. Hagmann, O. Sporns, "A spectrum of routing strategies for brain networks", *PLoS Computational Biology*, 2019. pdf

- J.A. Owen, **A. Kolchinsky**, D.H. Wolpert, "Number of hidden states needed to physically implement a given conditional distribution", *New Journal of Physics*, 2019. (correction) pdf
- **A. Kolchinsky** and D.H. Wolpert, "Semantic information, autonomous agency, and nonequilibrium statistical physics", *Royal Society Interface Focus*, 2018. pdf code
- A.M. Saxe, Y. Bansal, J. Dapello, M. Advani, **A. Kolchinsky**, B.D. Tracey, D.D. Cox, "On the information bottleneck theory of deep learning", *International Conference on Learning Representations (ICLR)*, 2018. pdf code
- **A. Kolchinsky**, N. Dhande, K. Park, Y.Y. Ahn, "The Minor Fall, the Major Lift: Inferring emotional valence of musical chords through lyrics", *Royal Society Open Science*, 2017. pdf data code
- **A. Kolchinsky**, D.H. Wolpert, "Dependence of dissipation on the initial distribution over states", *Journal of Statistical Mechanics*, 2017. pdf
- **A. Kolchinsky**, B.D. Tracey, "Estimating mixture entropy with pairwise distances", *Entropy*, 2017. (correction) pdf code
- **A. Kolchinsky**, A.J. Gates, L.M. Rocha, "Modularity and the spread of perturbations in complex dynamical systems," *Physical Review E*, 2015. pdf code
- **A. Kolchinsky**, A. Lourenço, H. Wu, L. Li, L.M. Rocha, "Extraction of pharmacokinetic evidence of drugdrug interactions from the literature," *PLOS One*, 2015. pdf
- **A. Kolchinsky**, M.P. van den Heuvel, A. Griffa, P. Hagmann, L.M. Rocha, O. Sporns, J. Goñi, "Multi-scale integration and predictability in resting state brain activity," *Frontiers in Neuroinformatics*, 2014. pdf
- A. Rossi, F.J. Parada, **A. Kolchinsky**, A. Puce, "Neural correlates of apparent motion perception of impoverished facial stimuli I: A comparison of ERP and ERSP activity," *NeuroImage*, 2014. pdf
- **A. Kolchinsky**, A. Lourenço, L. Li, L.M. Rocha, "Evaluation of linear classifiers on articles containing pharmacokinetic evidence of drug-drug interactions," *Proc Pacific Symposium on Biocomputing*, 2013. pdf
- **A. Kolchinsky** and L.M. Rocha, "Prediction and modularity in dynamical systems," *Proc of European Conf. on the Synthesis and Simulation of Living Systems (ECAL)*, 2011. pdf
- **A. Kolchinsky**, A. Abi-Haidar, J. Kaur, A.A. Hamed, L.M. Rocha, "Classification of protein-protein interaction full-text documents using text and citation network features," *IEEE/ACM Transactions on Computational Biology and Bioinformatics*, 2010. pdf

## **PREPRINTS**

- **A. Kolchinsky** and D.H. Wolpert, "The dependence of integrated, instantaneous, and fluctuating entropy production on the initial state in quantum and classical processes", arXiv:2103.05734, 2021. arxiv
- F.C. Sheldon, **A. Kolchinsky**, F. Caravelli, "The computational capacity of memristor reservoirs", arXiv:2009.00112, 2020. arxiv
- A. Kolchinsky, "A novel approach to multivariate redundancy and synergy", arXiv:1908.08642, 2019. arxiv
- C. Gokler, **A. Kolchinsky**, Z. Liu, I. Marvian , P. Shor, O. Shtanko, K. Thompson, D. Wolpert, S. Lloyd, "When is a bit worth much more than  $kT \ln 2$ ?", arXiv:1705.09598, 2017. arxiv
- **A. Kolchinsky**, I. Marvian, C. Gokler, Z. Liu, P. Shor, O. Shtanko, K. Thompson, D. Wolpert, S. Lloyd, "Maximizing free energy gain", arXiv:1705.00041, 2017. arxiv

#### TALKS Invited

- 02/2021 *Origins of Life: The Possible and the Actual* workshop, Santa Fe Institute "Fundamental thermodynamic constraints and trade-offs in origin of life"
- 7/2020 ICTP Seminar Series, Abdus Salam International Center for Theoretical Physics
- "Bounds on entropy production and thermodynamics of information under protocol constraints"
- 2/2020 AI Seminar Series, Information Sciences Institute, Los Angeles, CA
- "Machine Learning through the information bottleneck"
- 7/2019 ISTI Seminar Series, Los Alamos National Lab, Los Alamos, NM
- "Machine Learning through the information bottleneck"

6/2018 - *Connectomics Lecture Series*, Universidad Diego Portales, Santiago, Chile "Machine learning, 'deep neural networks', and the brain"

4/2018 - Meeting of the Society for the Neural Control of Movement, Santa Fe, NM  $\,$ 

"Machine learning, 'deep neural networks', and the brain"

4/2018 - SITE Santa Fe (contemporary art museum)

"Life, entropy, and the  $2^{nd}$  law of thermodynamics"

11/2017 - Seoul National University

"Science at the Santa Fe Institute" (w/ V. Ferdinand)

8/2017 - Thermodynamics & Computation: Towards a New Synthesis, Santa Fe Institute

"Statistical physics of Turing Machines" (w/ D.H. Wolpert)

10/2016 - Statistical Physics, Information Processing and Biology, Santa Fe Institute

"Dependence of dissipation on the initial distribution" (w/ D.H. Wolpert)

2/2016 - Information Sciences Institute, Los Angeles, CA

"Multi-scale integration & modularity in complex systems"

#### Contributed

3/2021 - American Physical Society March Meeting (virtual)

"Thermodynamics under protocol constraints" (w/ D.H. Wolpert)

6/2020 - Stochastic thermodynamics in complex systems, Complexity Science Hub, Vienna, Austria

"Entropy production & thermodynamics of information under protocol constraints"

5/2019 - Seminar, Max Planck Institute for Mathematics in the Sciences, Leipzig, Germany

"A novel measure of multivariate redundant information"

3/2019 - American Physical Society March Meeting, Boston, MA

"Thermodynamics of Turing Machines" (w/ D.H. Wolpert)

3/2018 - American Physical Society March Meeting, Los Angeles, CA

"Thermodynamic costs, initial distributions, and Bregman divergences" (w/ D.H. Wolpert)

1/2018 - Information theory and non-equilibrium thermodynamics beyond the Shannon-Gibbs framework, Complexity Science Hub, Vienna, Austria

"Entropy in stochastic thermodynamics"

12/2017 - Complexity, Criticality & Computation International Biannual Symposium, University of Sydney

"Grounding semantic information in the dynamics of non-equilibrium systems" (w/ D.H. Wolpert)

8/2017 - Information Engines at the Frontiers of Nanoscale Thermodynamics, Telluride, CO

"Semantic information, observation and non-equilibrium systems" (w/ D.H. Wolpert)

3/2017 - American Physical Society March Meeting, New Orleans, LA

"Dependence of dissipation on the initial distribution" (w/ D.H. Wolpert)

10/2015 - Information Theory, Ecosystems, & Schrodinger's Paradox workshop, Santa Fe Institute

"Complexity measures for spatially embedded systems"

9/2015 - Conference on Complex Systems 2015, Tempe, AZ

"Modularity and the spread of perturbations in complex dynamical systems" (w/ A.J. Gates, L.M. Rocha) (awarded "Honorable Mention Paper by a Contributing Student")

10/2013 - Indiana Neuroimaging Symposium, Indiana University, Bloomington, IN

"Information, space & structure in the human brain resting state" [poster] (w/ M.P. van den Heuvel, A. Griffa, P. Hagmann, L.M. Rocha, O. Sporns, J. Goñi)

9/2013 - Guided Self-Organization 6 workshop, European Conf on Complex Systems, Barcelona, Spain

"Modularity and dynamical timescales in Boolean Networks"

3/2013 - MBI Rhythms and Oscillations Workshop, Columbus, OH

"Studying differences in oscillatory synchronization with tensor-factorization" [poster] (w/ F.J. Parada, L.M. Rocha, T. Busey)

1/2013 - Pacific Symposium on Biocomputing, Big Island, Hawaii

"Evaluation of linear classifiers on articles containing pharmacokinetic evidence of drug-drug interactions"

12/2011 - Network Frontier Workshop, Northwestern University, Evanston, IL

"Prediction and modularity in dynamical systems"

4/2011 - CISAB Animal Behavior Conference, Indiana University, Bloomington, IN

"The Umwelt, artificial life, and evolution"

9/2010 - Guided Self-Organization 3 work, Indiana University, Bloomington, IN

"Identifying dynamical modules in Boolean network models"

3/2008 - Interdisciplinary Symposium on the Mind, University of Toronto

"The Expanded Mind: Mental expansion and the intentional stance"

#### **GRANTS**

9/2019 - Foundational Questions Institute (FQXi), "The role of constraints in the thermodynamics of intelligence" (FQXi-RFP-IPW-1912), \$118,100, Co-Investigator

8/2016 - Foundational Questions Institute (FQXi), "Observers as self-maintaining non-equilibrium systems" (FQXi-RFP-1622), \$128,319, Co-Investigator

# TEACHING

# **Invited Lectures**

6/2019 - Santa Fe Institute Complex Systems Summer School, Santa Fe, NM

### Workshops

3/2019 - Santa Fe Institute, Santa Fe, NM

"Machine learning with TensorFlow"

6/2017, 6/2018 - Santa Fe Institute, Santa Fe, NM

Introduction to programming and data analysis in Python (w/ V. Ferdinand)

11/2017 - Seoul National University, Seoul

"Thermodynamics, evolution, and inference through the lens of information theory" (w/ V. Ferdinand)

11/2017 - ACtioN/Trustee Meeting, Santa Fe Institute, Santa Fe, NM

"Machine learning: A guide for the perplexed" (w/ B. D. Tracey)

# **Teaching Assistant**

Indiana University, Bloomington, IN

Spring 2014 - "I400 Large-scale Social Phenomena" [link]

Spring 2011 - "I201 Math and logic foundations of Informatics"

Fall 2010 - "I485 Biologically Inspired Computing" [link]

Fall 2008-Spring 2009 - "I210 Information Infrastructure" (Python programming)

Instituto Gulbenkian de Ciência, Oeiras, Portugal

Spring 2010 - "Bayesian brain" educational module

### ADVISING

Nicolas Freitas, Santa Fe Institute REU Program, Santa Fe, NM, June-August, 2018

Project: "Scaling of Information in Biochemical Systems"

Francis Cavanna, Santa Fe Institute REU Program, Santa Fe, NM, June-August, 2017

Project: "Investigating the relationship between criticality and Landauer costs using the Ising model"

# ACADEMIC SERVICE

Reviewer: Applied Sciences, Entropy, PLoS Computational Biology, CRC Press.

2008-2013 - Started and ran a weekly discussion group on complexity, dynamical systems, and embodiment in cognitive science, Indiana University, Bloomington, IN link

# AWARDS & FELLOWSHIPS

2010-2015 - Affiliate of IGERT training program in "Dynamics of brain-body-environment interaction in behavior and cognition"

2012 - 2013 - Lilly Graduate Fellowship, Biocomplexity Institute, Indiana University, Bloomington, IN

2007 - 2009 - Eli Lilly Fellowship, Indiana University, Bloomington, IN,

2004 - Dean's List Gallatin School, New York University, NY

**SKILLS** *Programming*: Python, MATLAB, C, C++, R, Java

Machine learning with Python + Keras, TensorFlow

Web programming, databases/SQL, scalable computing (Hadoop, PIG, Scala)

Languages: Fluency: English, Russian, Spanish / Basic: Portuguese